



**Barcelona
Supercomputing
Center**
Centro Nacional de Supercomputación



**UNIVERSITAT POLITÈCNICA
DE CATALUNYA
BARCELONATECH**

Modeling dust mineralogy and its impacts on the Earth System

María Gonçalves Ageitos

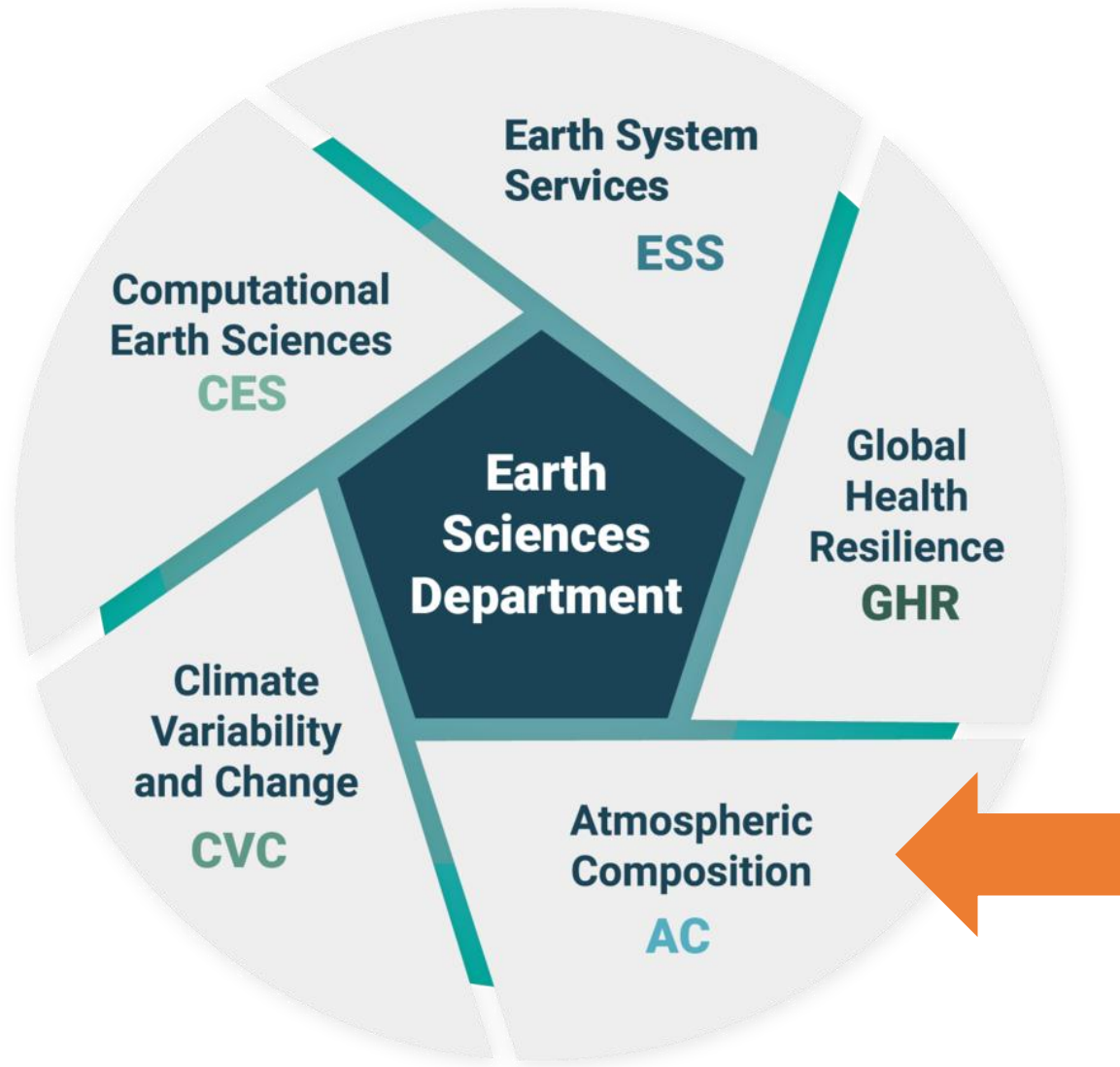
Associated researcher

Atmospheric Composition Group. Earth Sciences Department. BSC.

Associated professor

Project and Construction Engineering Department. UPC.

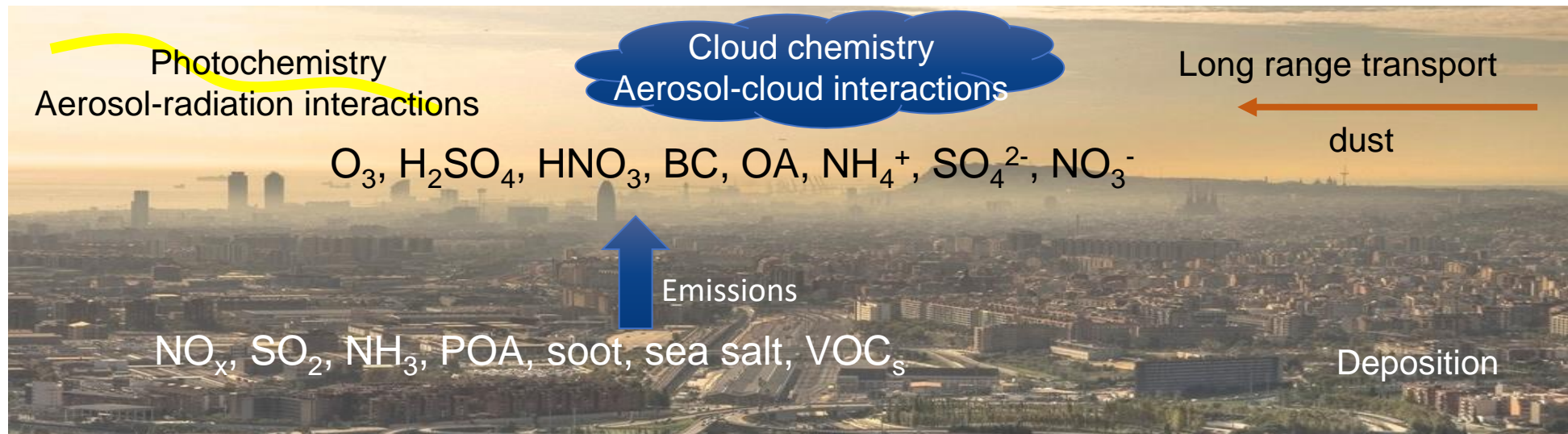
The Earth Sciences Department at BSC



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Oriol Jorba (oriol.jorba@bsc.es)
20 people

AC Main goal

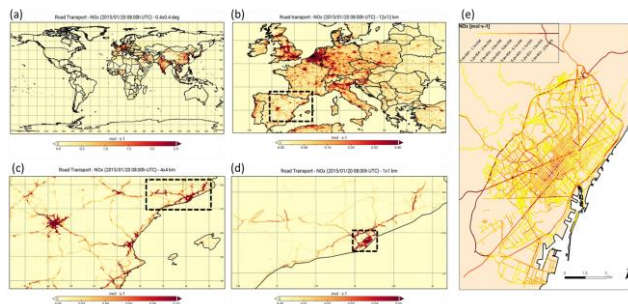
To **understand**, **constrain** and **predict** the spatiotemporal variations of **atmospheric pollutants** **across scales** along with their effects upon **air quality**, **health**, **weather** and **climate**.



Model and tool developments

HERMESv3

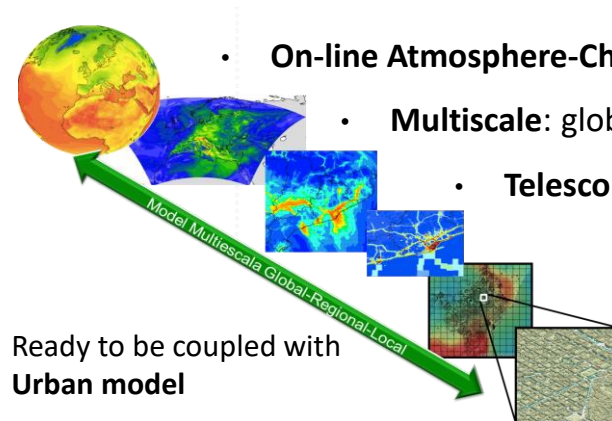
A python-based, open source, parallel and multiscale emission model



MONARCH

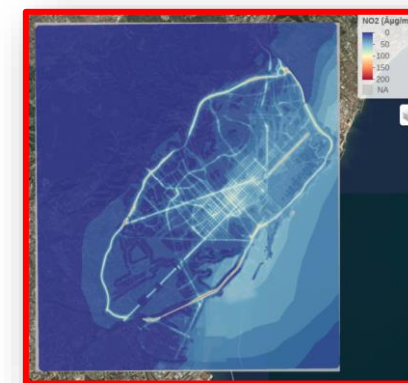


- On-line Atmosphere-Chemistry coupling
- Multiscale: global to local (1km)
- Telescoping nesting

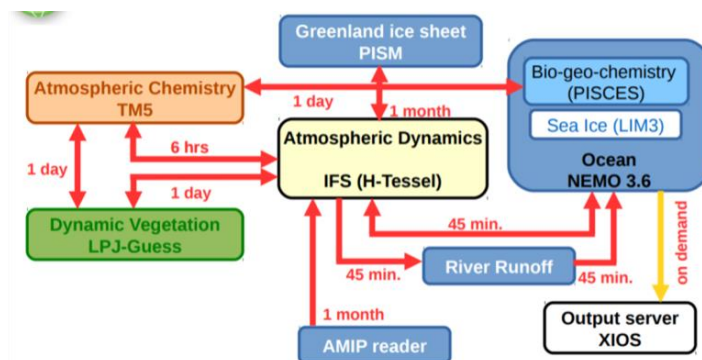


CALIOPE-Urban

Street-scale dispersion model



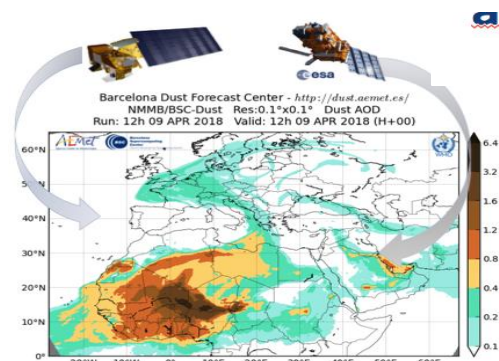
EC-Earth3-AerChem



Schematics of the EC-Earth version 3 components and the coupling frequency between them.

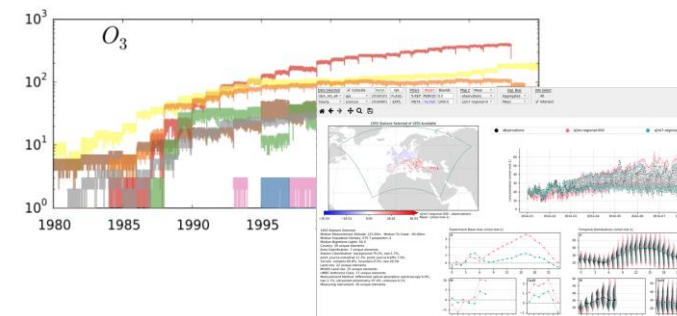
LETKF DA

Ensemble based Data Assimilation system



GHOST/Providentia

Harmonised treatment of observations and dynamic/flexible evaluation system

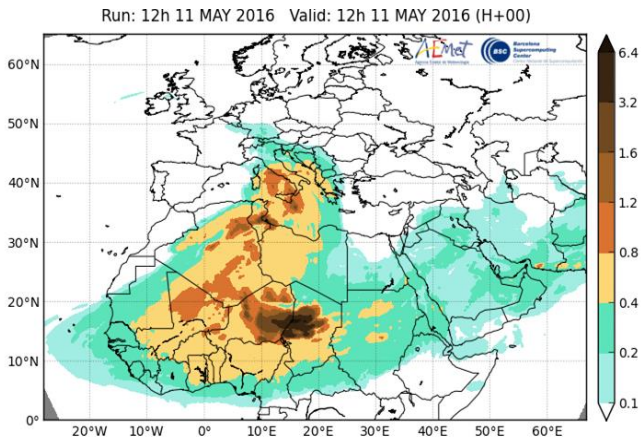


In collaboration with CES, ESS and CVC

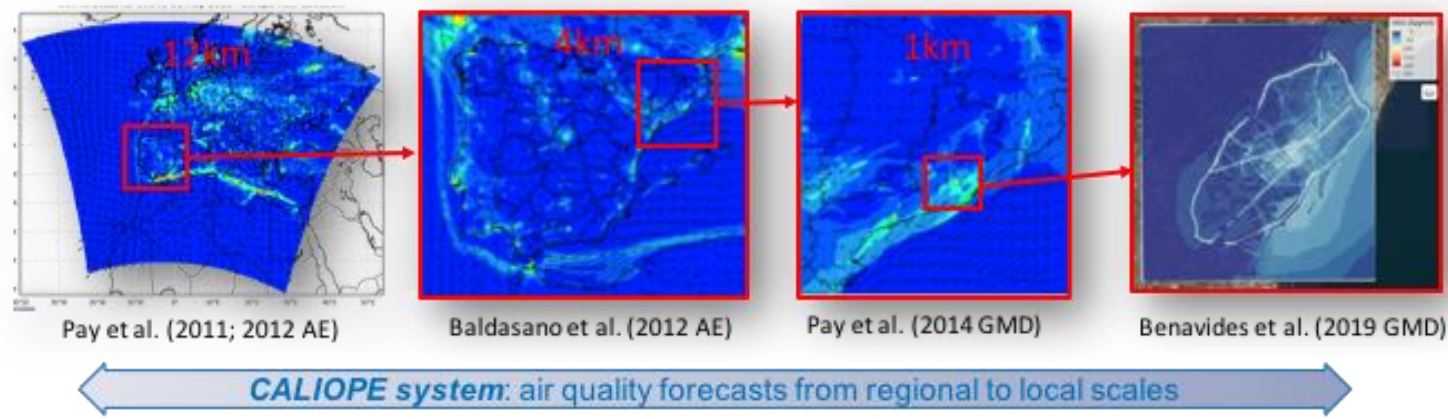
Forecasts, reanalysis, services

WMO Dust Regional Centers

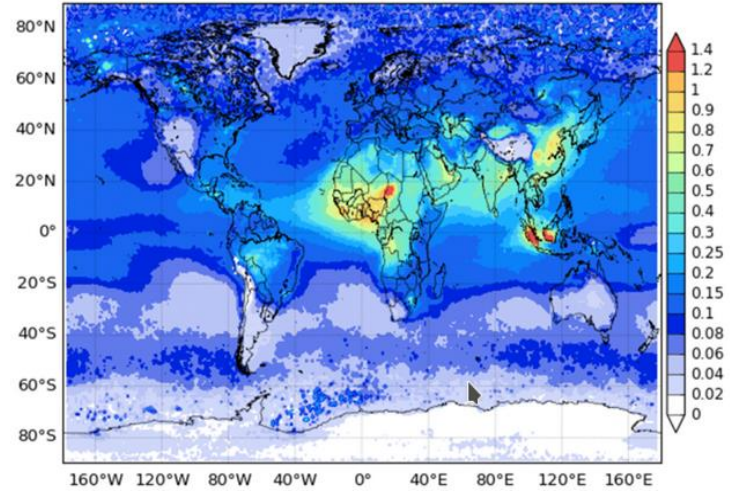
Dust forecasts and reanalysis



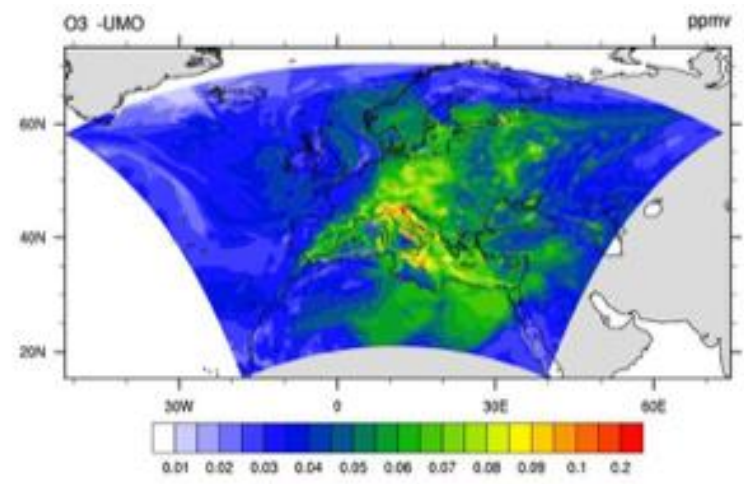
CALIOPE Air Quality Forecast system



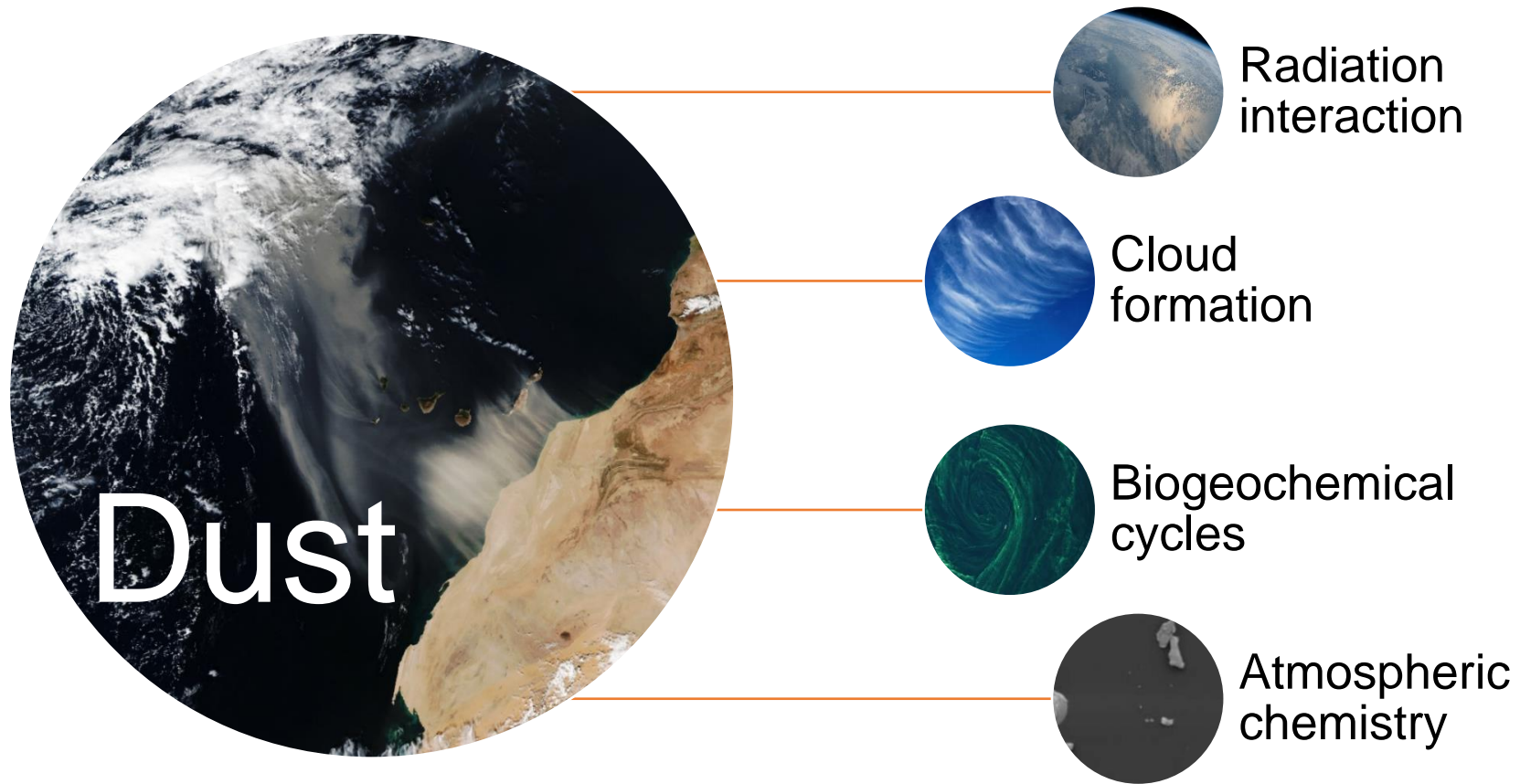
ICAP global aerosol ensemble



CAMS air quality regional ensemble



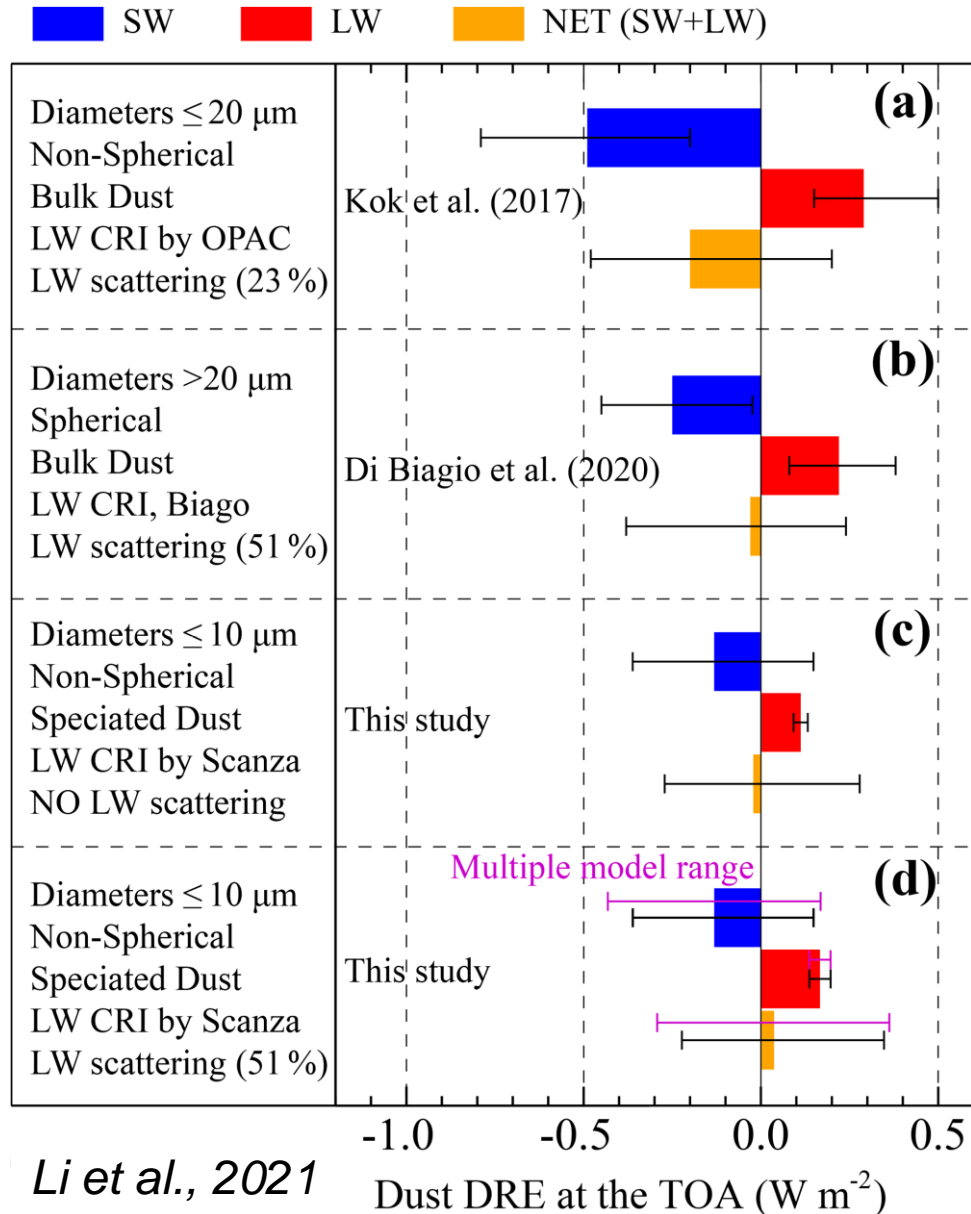
Dust mineralogy modeling



... these impacts are modulated by mineralogy.

Image credits: NASA, NOAA, Krueger et al. (2004)

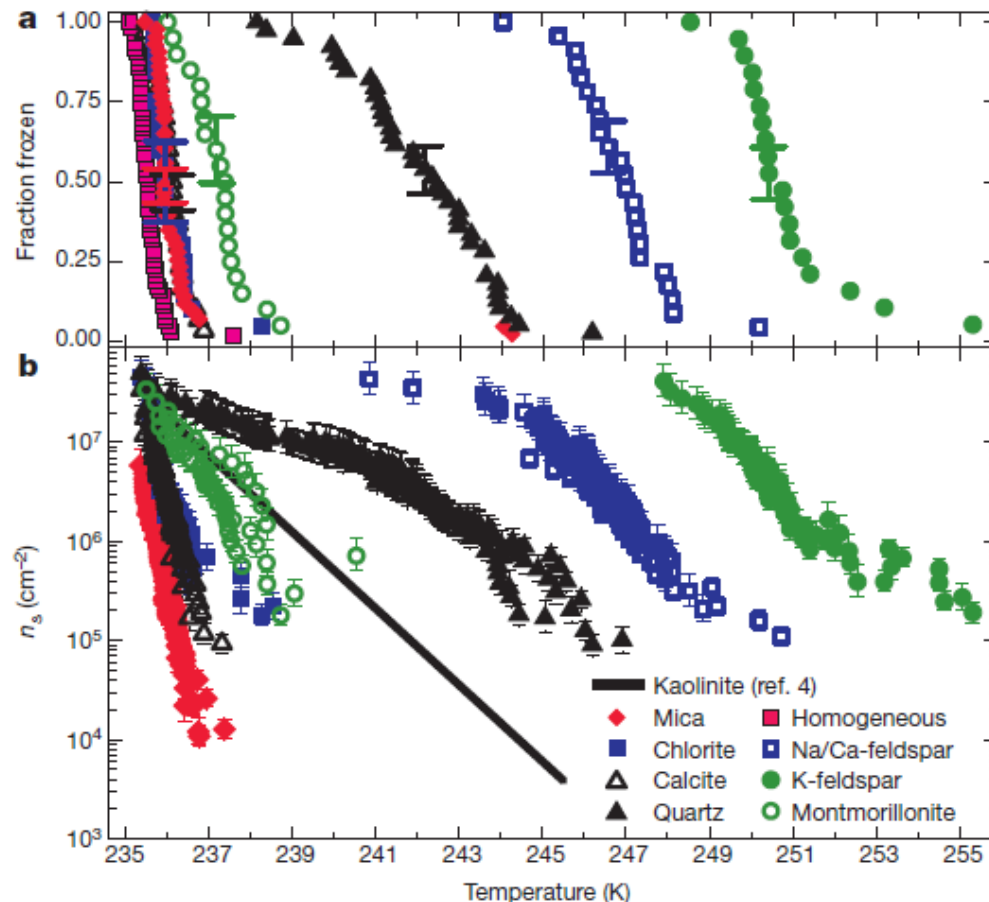
Dust interaction with radiation



- **Dust absorption in the shortwave** linearly correlates with the amount of **iron oxides** (e.g., DiBiagio et al., 2019; Möösmüller et al., 2012)
- Li et al. (2021) multi-model study **attributes 97% of the uncertainty range in dust DRE** to uncertainties in the abundance of **iron oxides**.

Dust as ice nuclei

- **K-feldspars** (Atkinson et al., 2013), and **quartz** (Harrison et al., 2019) have been singled out as **effective ice nuclei**.

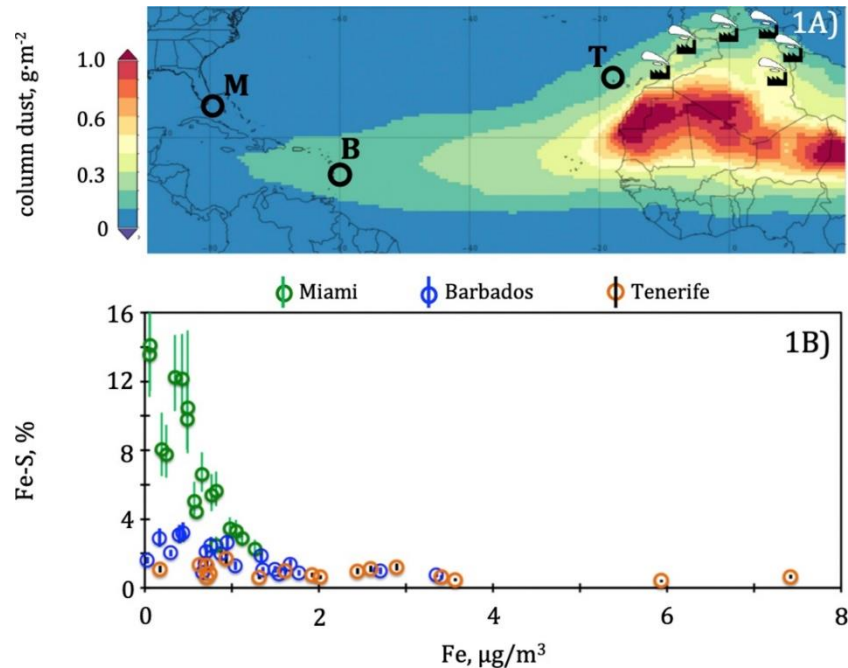


Experimental results showing k-feldspar particles freezing at warmer temperatures than other mineral components

Fraction of droplets (top) and nucleation site density (bottom), with 14–16 μm in diameter and containing a range of minerals in dust, frozen as a function of temperature during cooling, as detected in Atkinson et al. 2013 experiments.

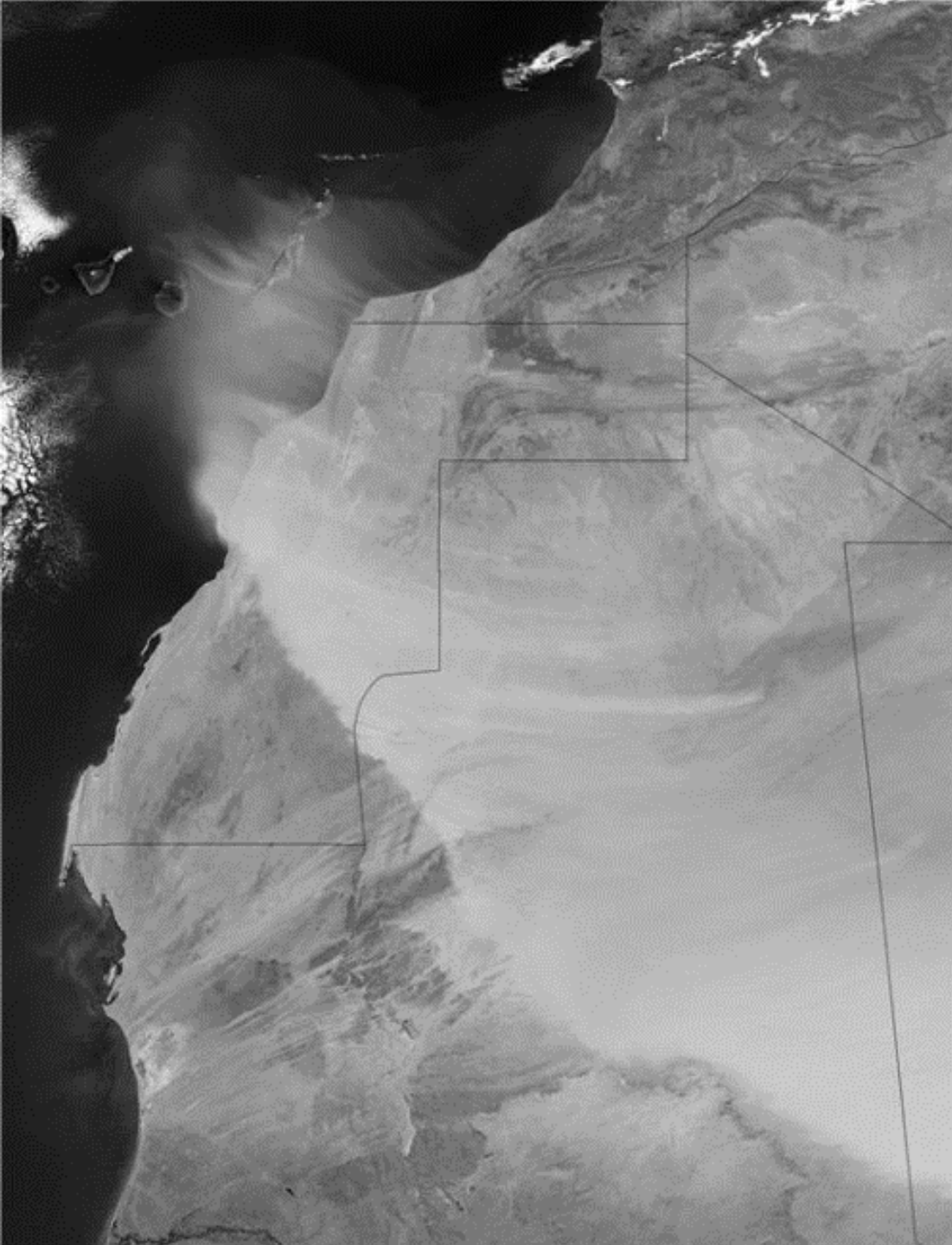
Nutrients in dust

- Mineral dust is a relevant source of **dissolved iron** to open ocean waters (e.g. Jickells et al., 2005; Conway et al. 2014), and it has been found to play a role on the fertilization of the Amazon forest (e.g. Yu et al., 2015).
- The **iron content**, but also its **solubility** is related to the dust mineral composition (e.g. Journet et al., 2009, Shi et al., 2011; Shi et al., 2012).



Rodriguez et al. (2021)

Iron solubility (Fe-S) versus iron in samples collected in Tenerife, Barbados and Miami during July and August 2015.

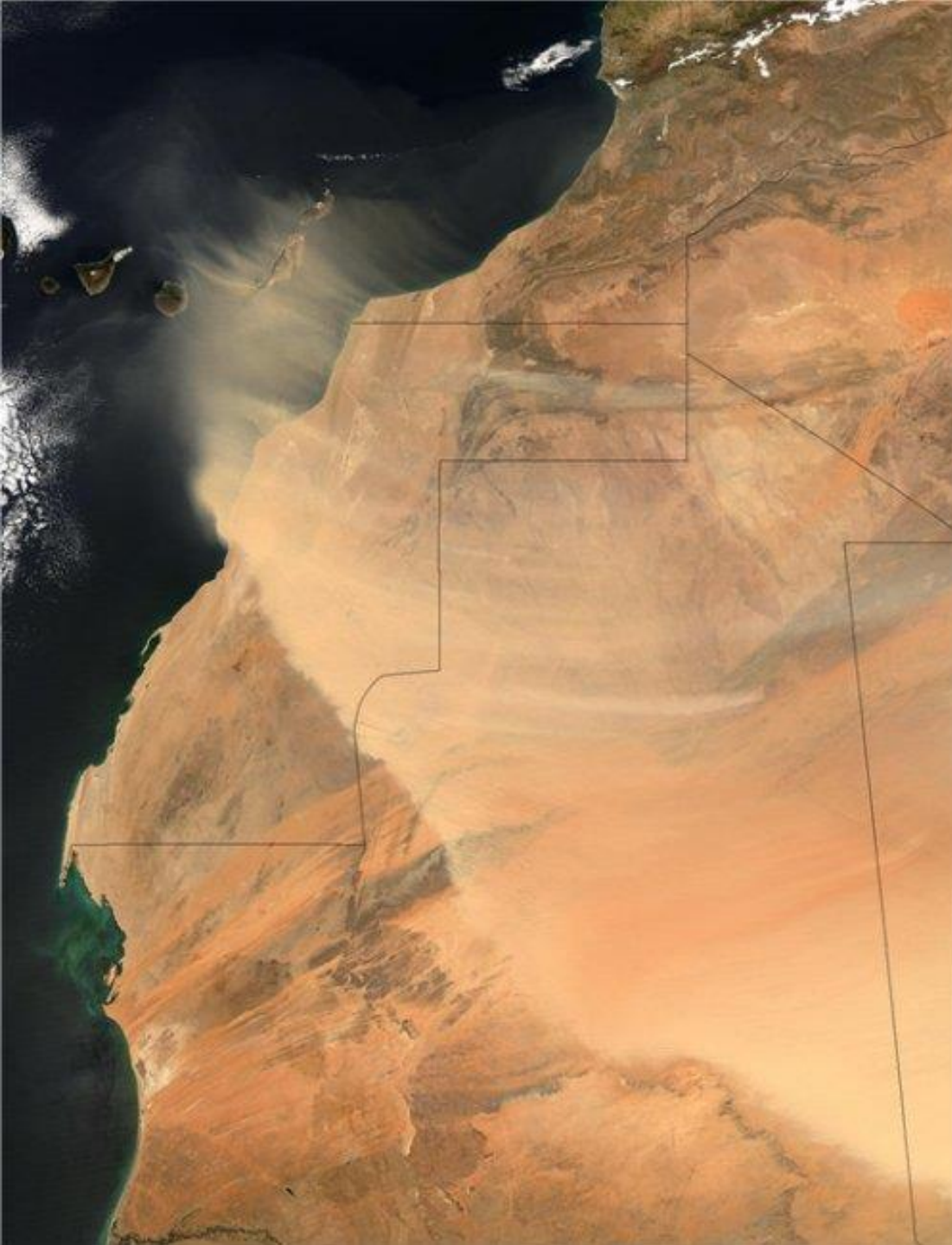


Many ESMs still consider dust as a homogeneous species, mainly because of...

... our limited knowledge of the **composition of parent soils**

... and the resulting **size-distributed mineralogy at emission,**

... and, to a lesser extent, the increase in computational burden.



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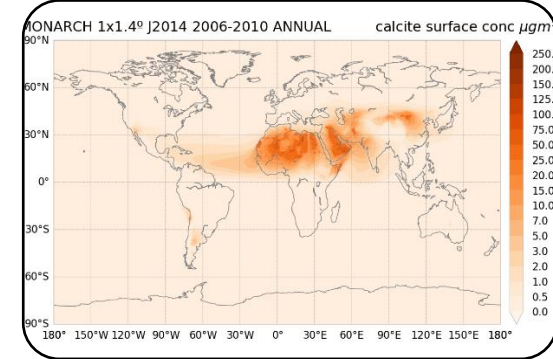
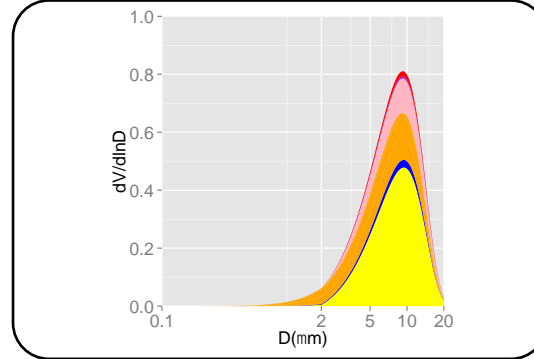
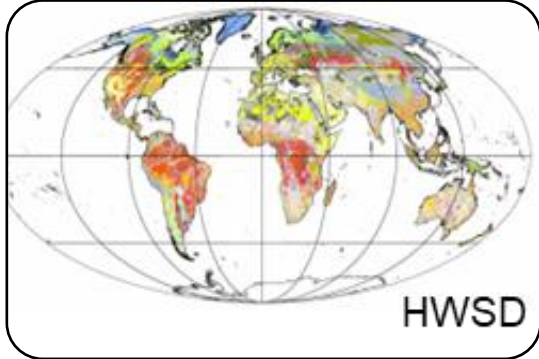
Today:

Our current understanding of the airborne dust mineralogy

Impact of considering mineralogy in different aspects of the climate system

Open questions and future research

Modelling dust mineralogy



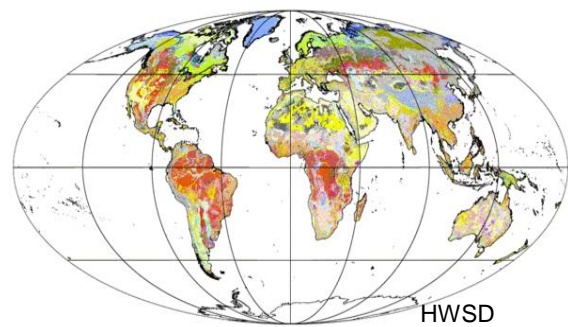
Soil
mineralogy

Emitted
size-
resolved
mineral
fractions

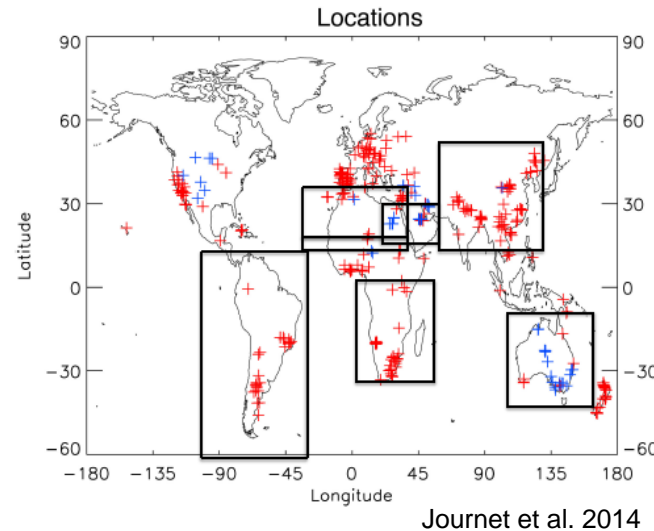
Minerals'
atmospheric
cycle

Global soil mineralogy atlases

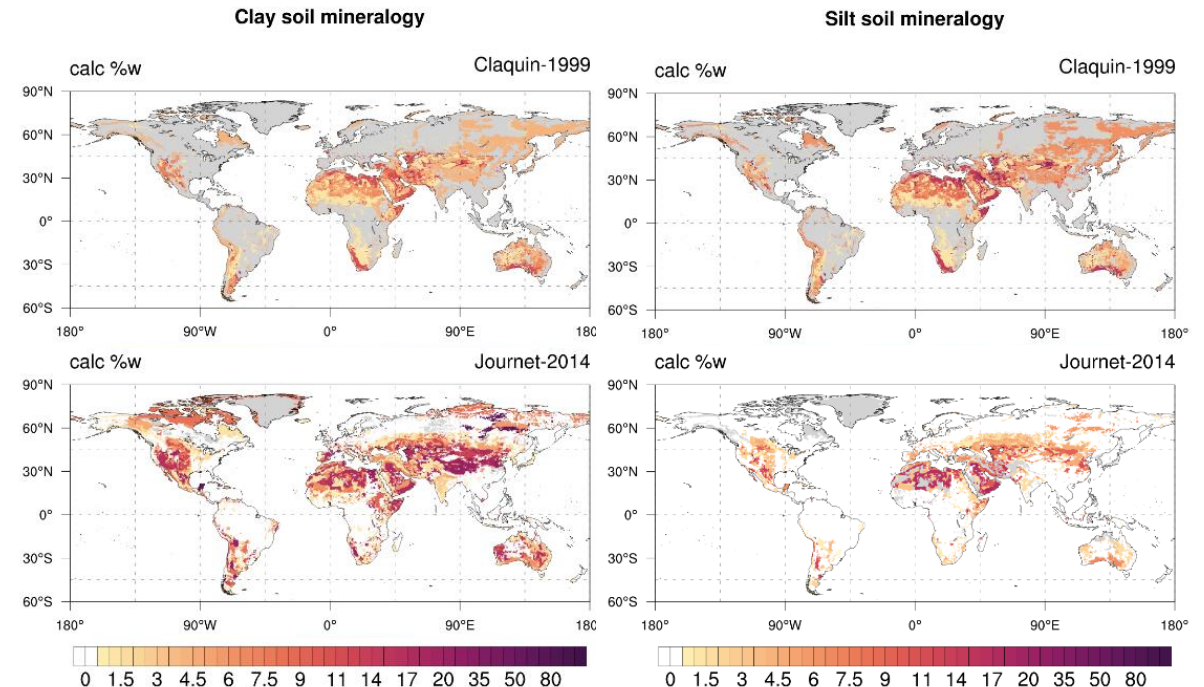
- **Claquin et al. 1999, Nickovic et al. 2012: 8 minerals. C1999**
Illite, smectite, kaolinite, quartz, feldspars, calcite, gypsum and hematite (iron oxides).
- **Journet et al. 2014: 12 minerals. J2014**
Illite, smectite, kaolinite, vermiculite, chlorite, mica, quartz, feldspars, calcite, gypsum, hematite and goethite.



FAO soil classification



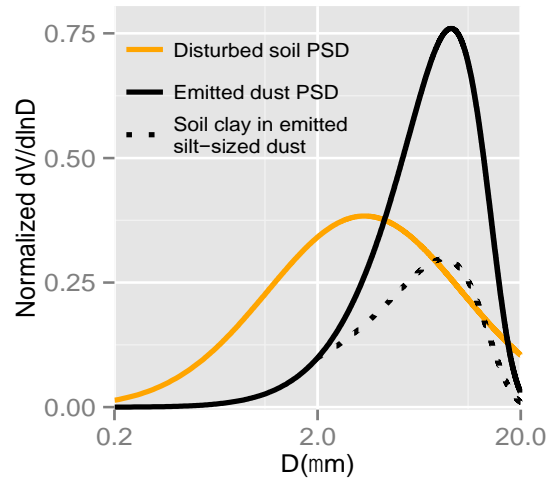
Mean mineralogy



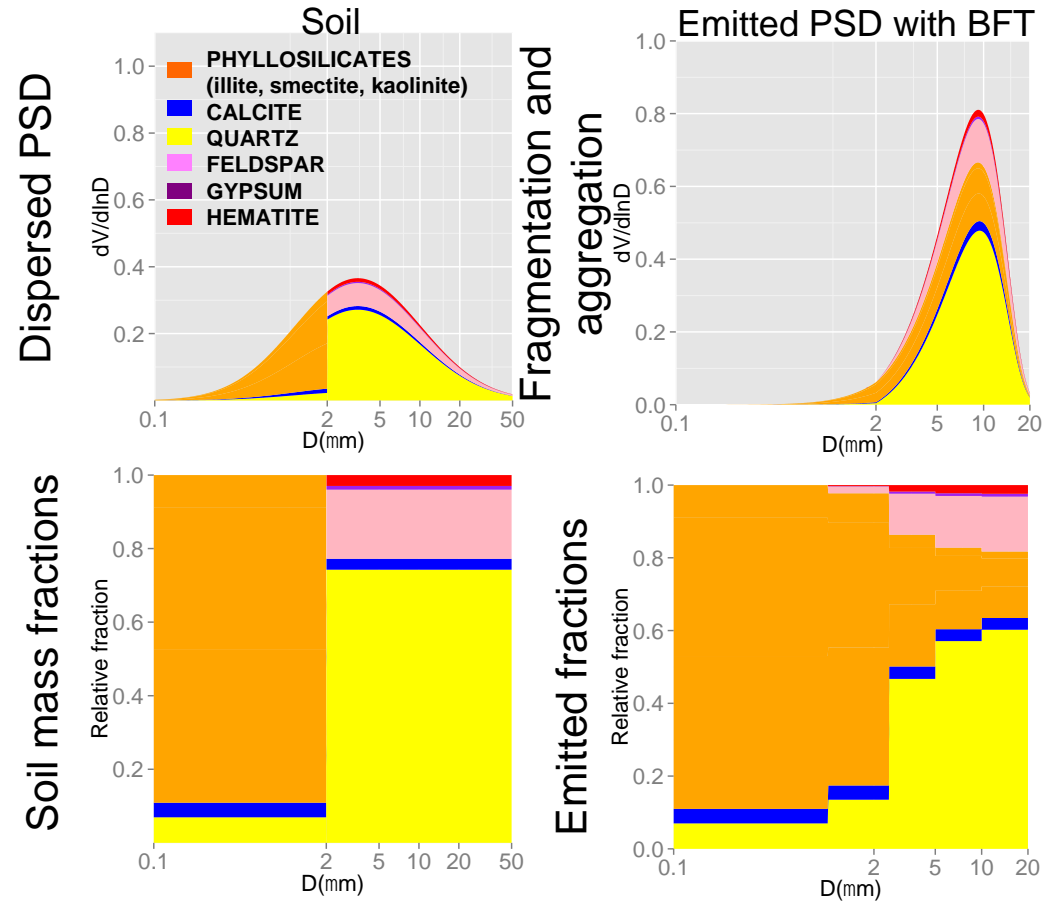
Mineralogical composition for
clay ($\phi < 2 \mu\text{m}$) and silt ($\phi 2\text{-}63 \mu\text{m}$) size classes

Dust emitted PSD and mineralogy

Brittle Fragmentation Theory (Kok, 2011)

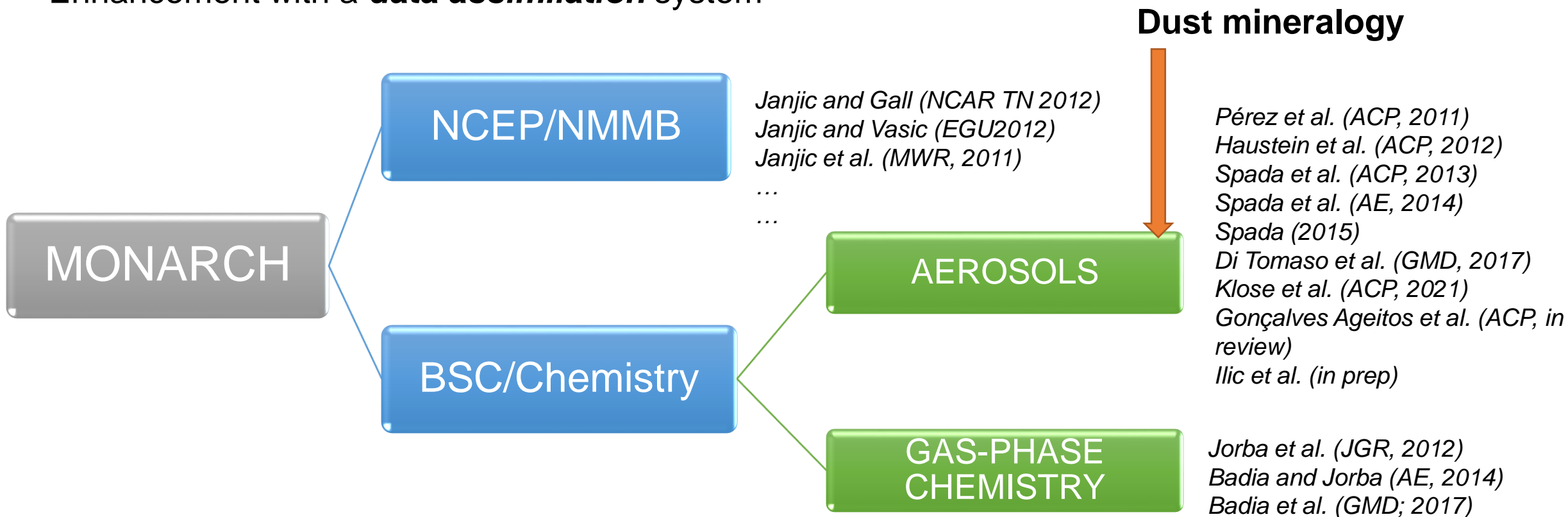


*Perlwitz et al., 2015a,b;
Pérez García-Pando et al., 2016;
Pérez García-Pando et al., in prep*



The MONARCH model

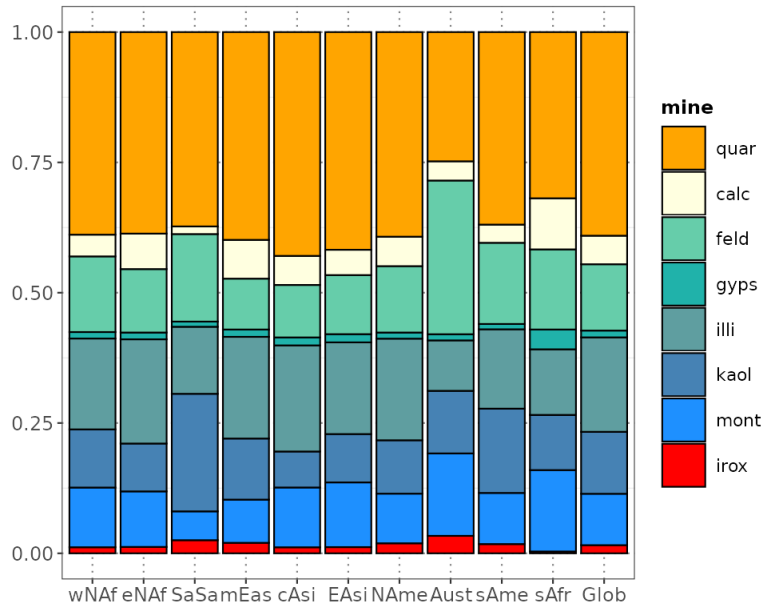
- **Multiscale**: global to regional (up to 1km) scales allowed
- Fully **on-line** coupling: weather-chemistry feedback processes allowed
- Enhancement with a **data assimilation** system



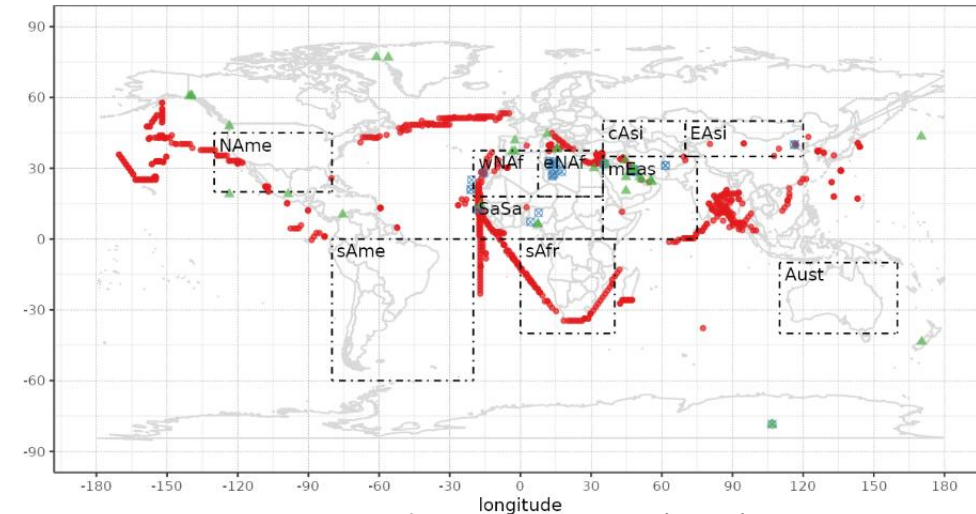
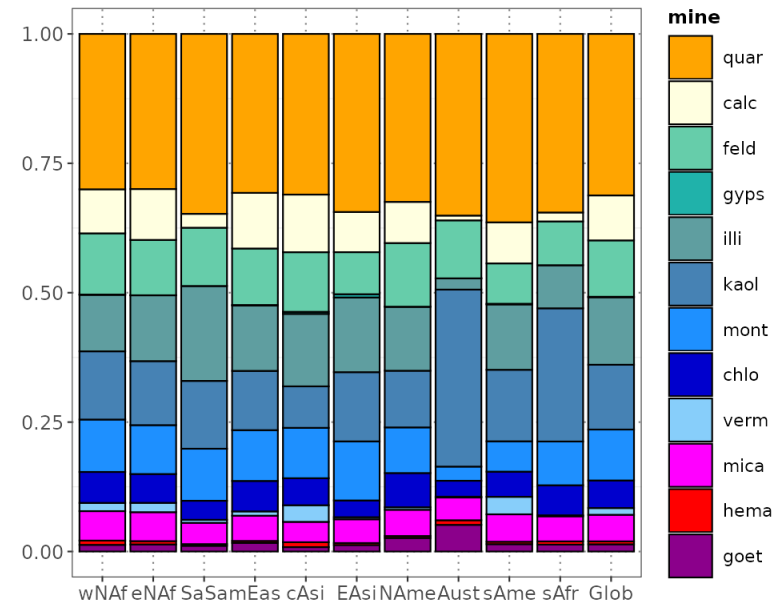
Emitted dust mineralogy according to MONARCH

C1999 and J2014

Mineral fractions in annual emission budget
MONARCH 2006-2010 C1999



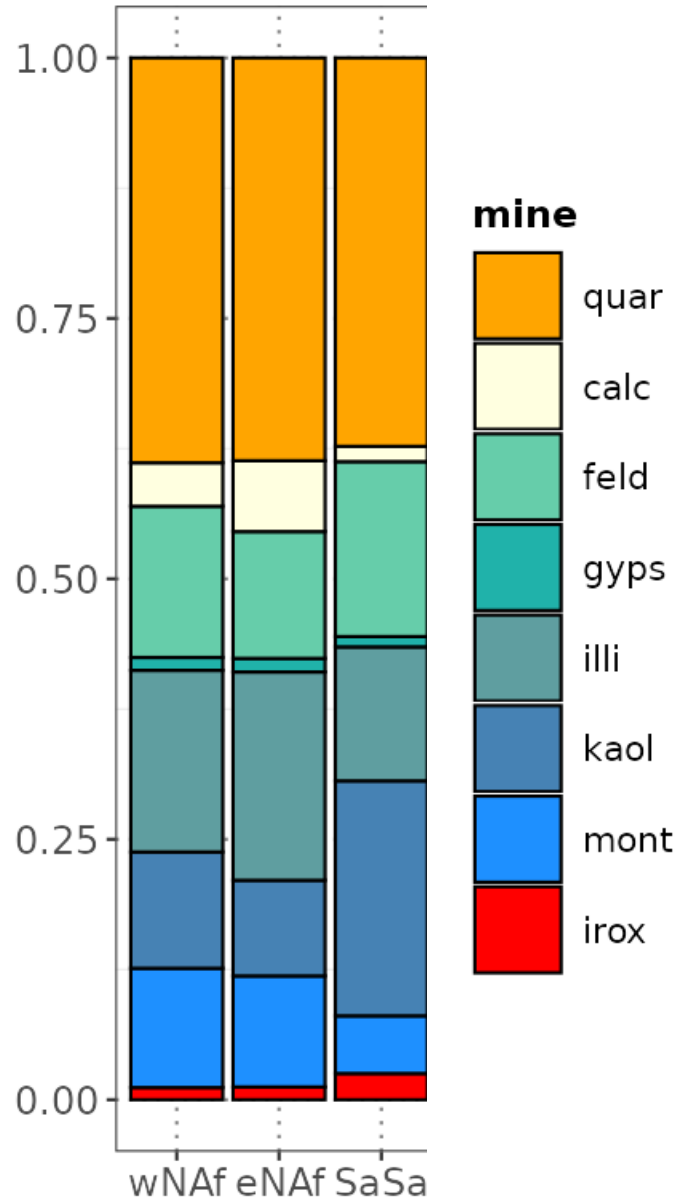
Mineral fractions in annual emission budget
MONARCH 2006-2010 J2014



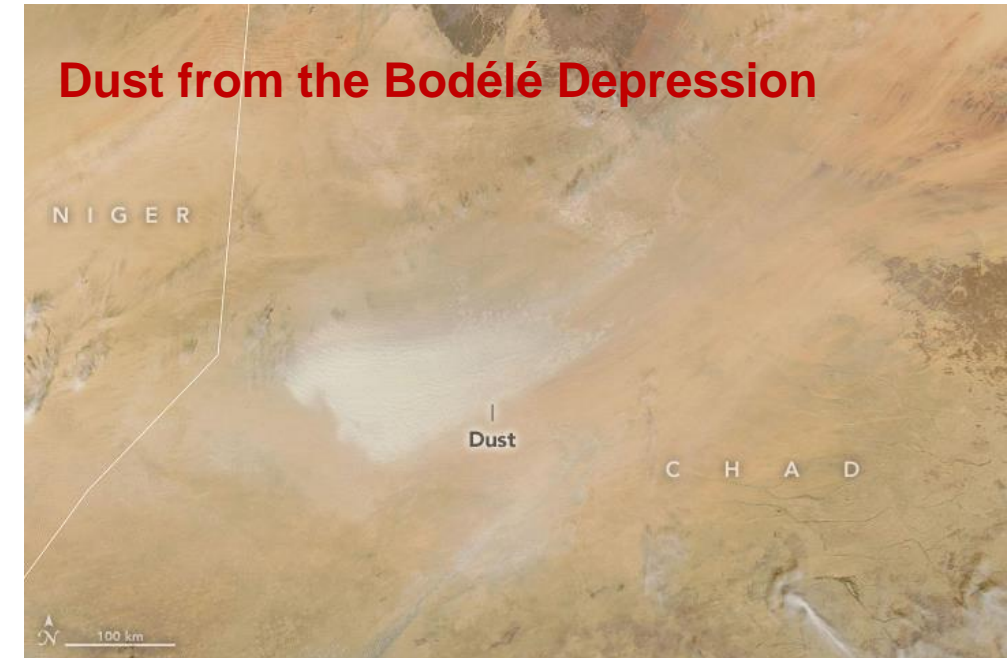
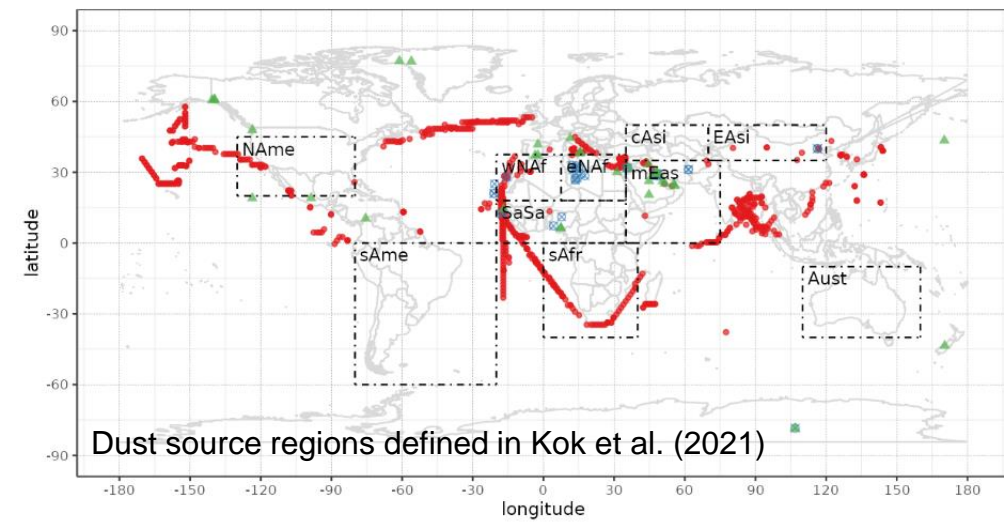
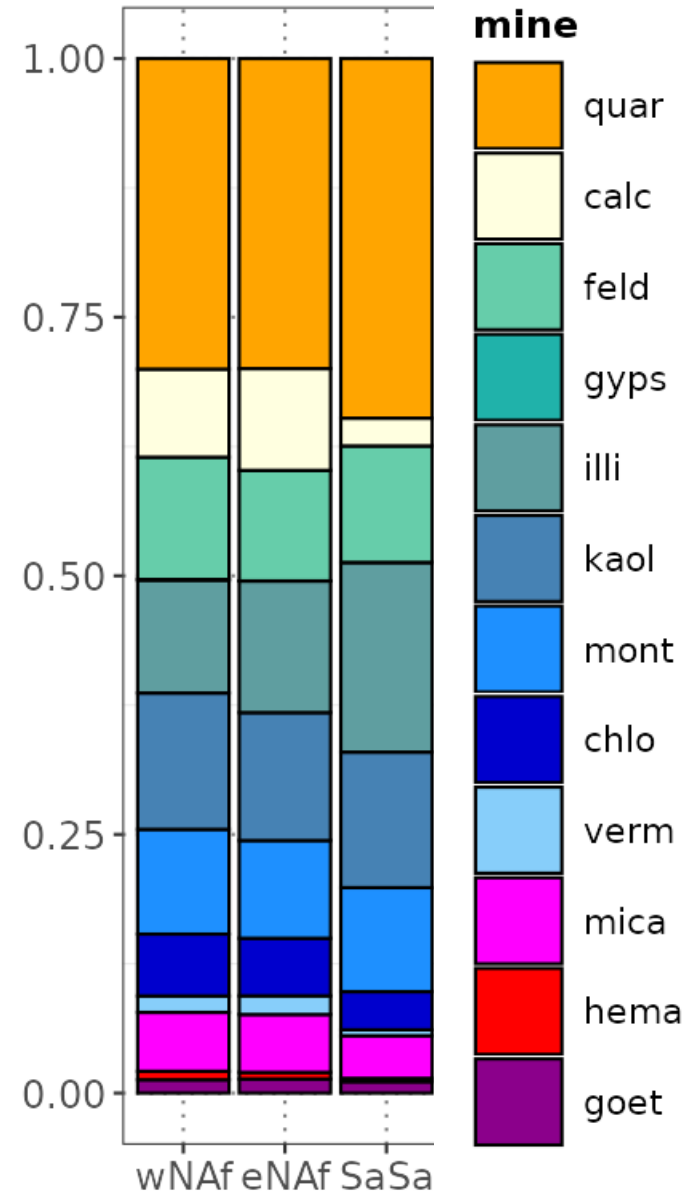
Dust source regions defined in Kok et al. (2021)

Emitted mass fractions per region and globally depending on the soil map used

C1999



J2014





Credit: NASA Earth Observatory images by Lauren Dauphin, using MODIS data from [NASA EOSDIS/LANCE](#) and [GIBS/Worldview](#)

Some models including dust mineralogy

Model	CESM-CAM6	MONARCH	GFDL-AM4	GISS-ModelE	IFS-Aer
Soil mineralogy	C1999	C1999 J2014	C1999	C1999	J2014
PSD	Modal model 3 modes	Sectional model 8 bins	Sectional model 5 bins	Sectional model 5 bins	Sectional model 3 bins
Size range (diameter)	10 μm	20 μm	20 μm	32 μm	40 μm
Emission method	BFT	BFT	BFT	Modified BFT	Projected
Mixing state	Internally mixed	Externally mixed Fraction of iron oxides mixed with other minerals	Externally mixed Fraction of iron oxides mixed with other minerals	Externally mixed Fraction of iron oxides mixed with other minerals	Externally mixed
References	Scanza et al. (2015), Hamilton et al. (2019), Li et al. (2021)	Gonçalves Ageitos et al. (in review), Klose et al. (2021)	Horowitz et al. (2020)	Obiso et al. (2023, in review), Perlwitz et al. (2015a,b)	Remy et al. (2022)

Some models including dust mineralogy

Model	CESM-CAM6	MONARCH 	GFDL-AM4 	GISS-ModelE	IFS-Aer
Resolution	1° x 1.25°	1° x 1.4°	1° x 1.25°	2° x 2.5°	T255L91 (0.7°)
Simulation period	2007-2011	2006-2010	2001-2020	2011-2020	2017-2020
Mode	Nudged towards reanalysis	Re-initialized every 24 h with reanalysis	Nudged towards reanalysis	Nudged towards reanalysis	Re-initialized with reanalysis

*Model data has been provided by L. Li, N. M. Mahowald, Q. Song, P. Ginoux, V. Obiso, R.L. Miller, and S. Remy
In the context of EMIT and CAMS2-35 projects*

Variability across models: same soil map.

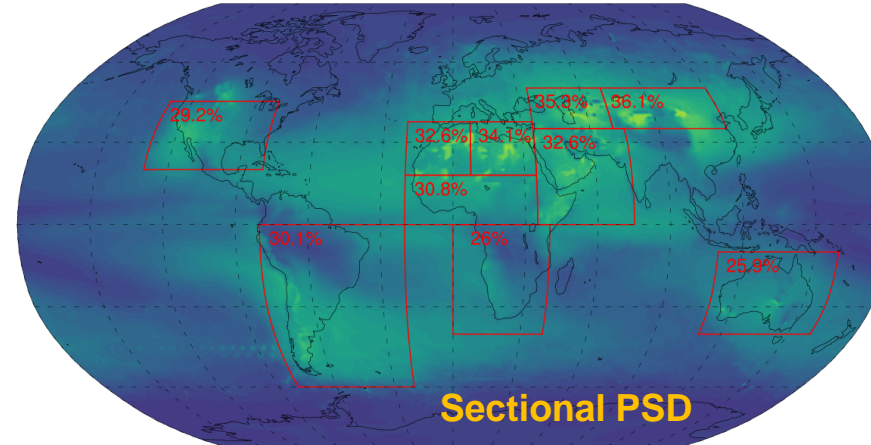
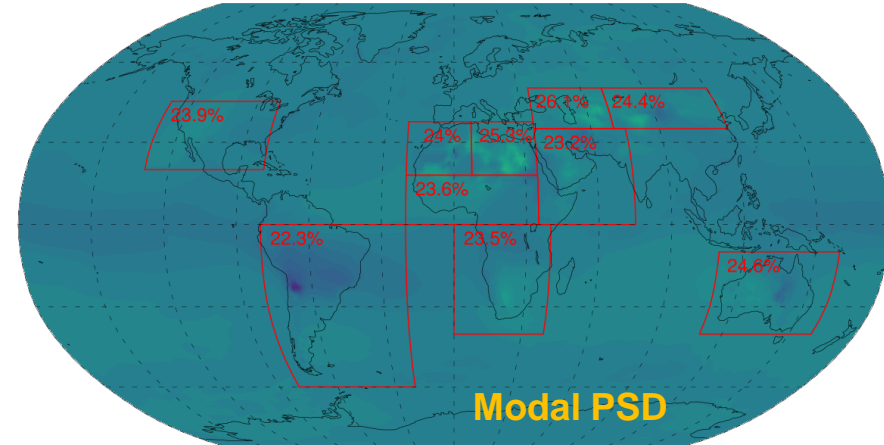
Quartz mass fraction (%w) at surface PM10 concentration.

quartz (%w) PM10 avg: 23.9

CESM CAM6 C1999

quartz (%w) PM10 avg: 32.26

MONARCH C1999



Larger differences in transport or remote regions than over sources.

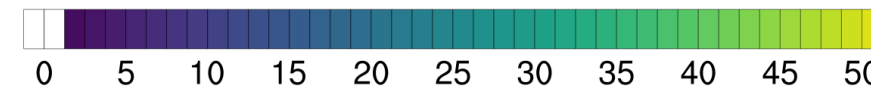
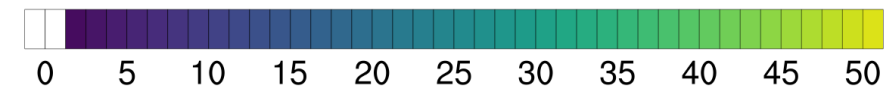
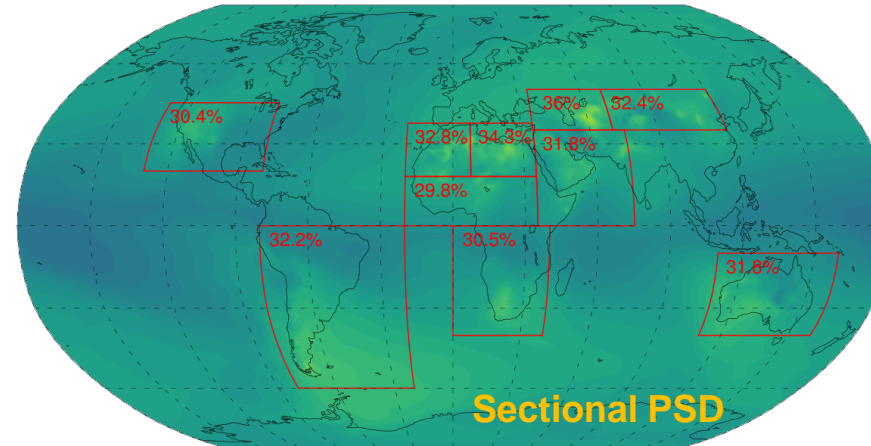
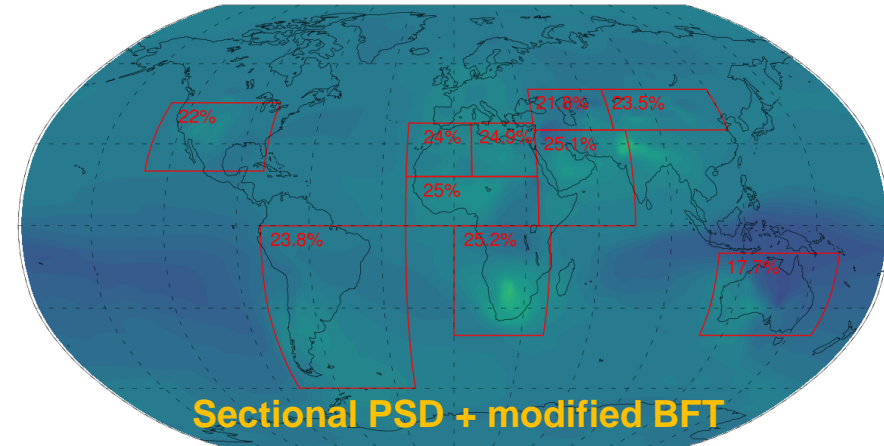
Differences in the representation of PSD, transport or removal processes → variability across models.

quartz (%w) PM10 avg: 21.53

ModelE C1999

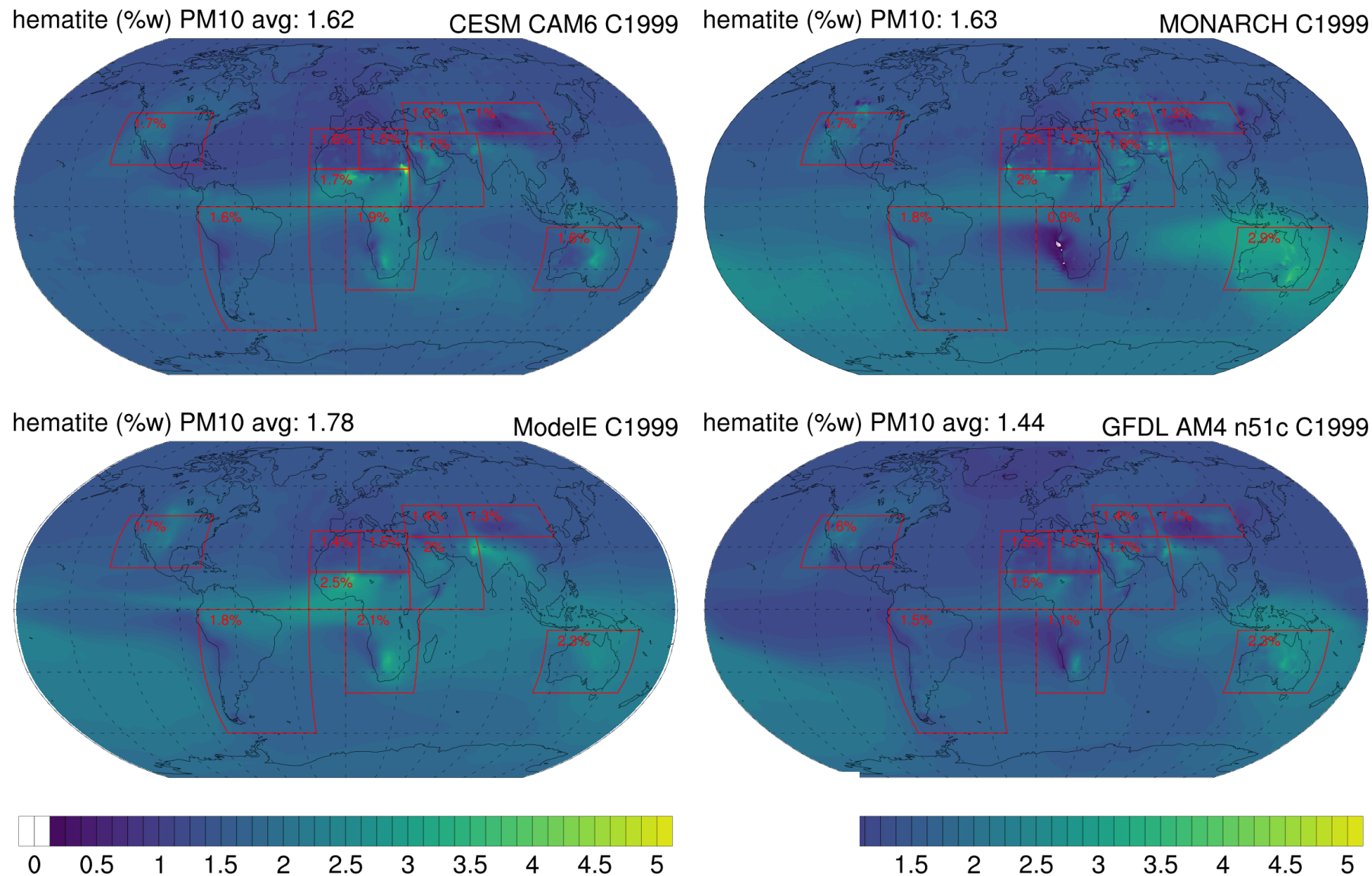
quartz (%w) PM10 avg: 32.38

GFDL AM4 n51c C1999



Variability across models: same soil map.

Hematite mass fraction (%w) at surface PM10 concentration.



Common regional differences: contrast Sahara – Sahel

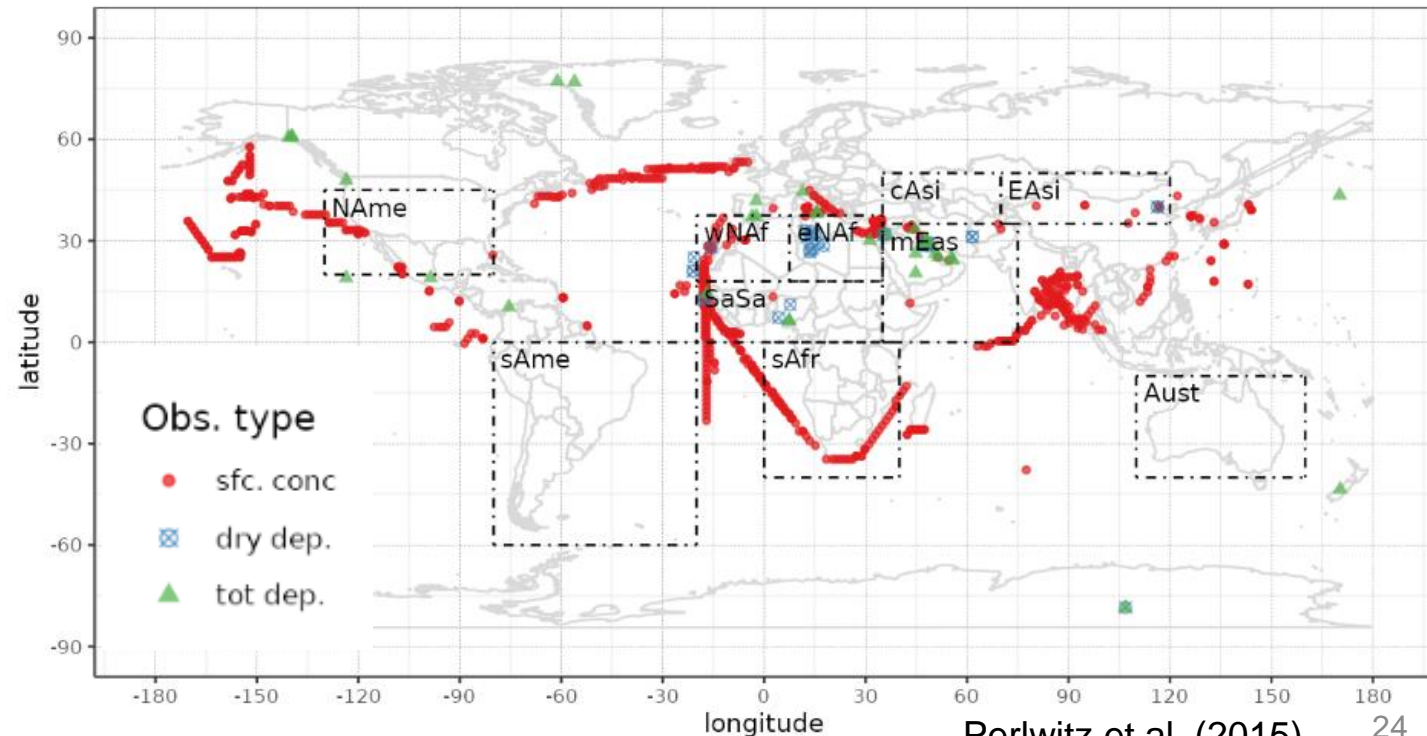
Australia – rich in iron oxides



Credit: Getty images

Observations of mineral mass fractions

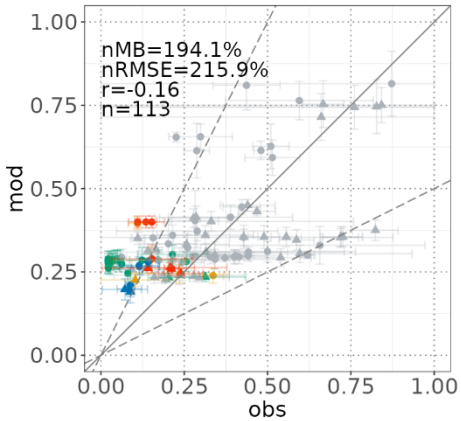
- Obs. from the late 60's to date.
 - Sampling time vs. model average: Temporal collocation – monthly basis
 - Reported minerals vs. modelled minerals: Mineral fractions estimated over those minerals observed AND modelled
 - Size range of observations vs. modelled size range: Size collocation
-
- Statistics in the plots use data in the modelled size ranges.
 - Normalized Mean Bias (nMB)
 - Normalized Root Mean Square Error (nRMSE)
 - Correlation (r)
 - Number of measurements in the samples used for the comparison (n)



Quartz mass fraction evaluation

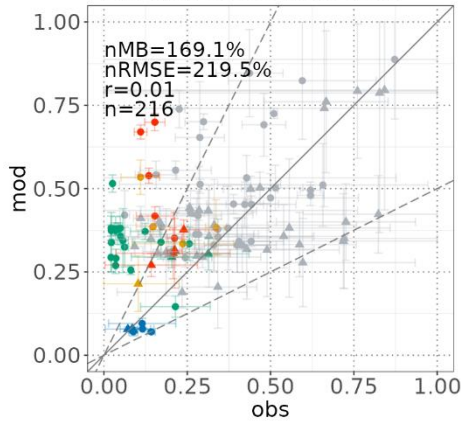
CESM-CAM6

quar mass ratio
CAM6 C1999 2007-2011



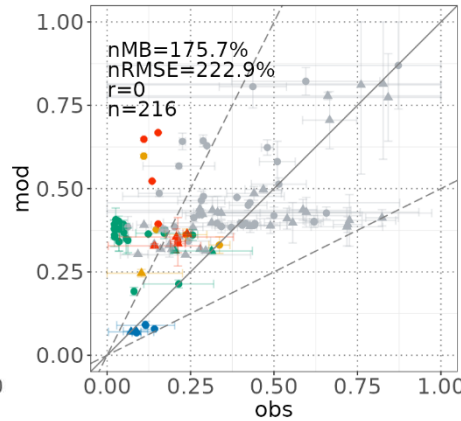
MONARCH

quar mass ratio
MONARCH C1999 2006-2010



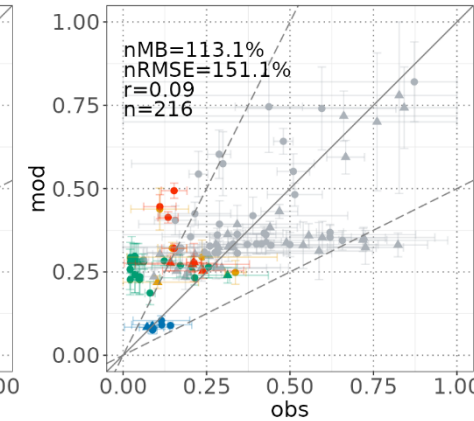
GFDL-AM4

quar mass ratio
GFDL-AM4 C1999 2001-2020



GISS-ModelE

quar mass ratio
ModelE C1999 2011-2020

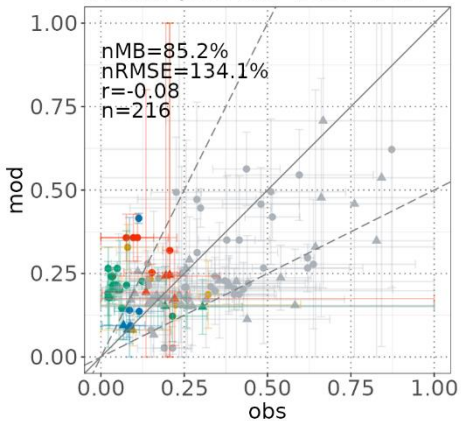


Size range

- <2um
- <10um
- <20um
- bulk
- 2-20um

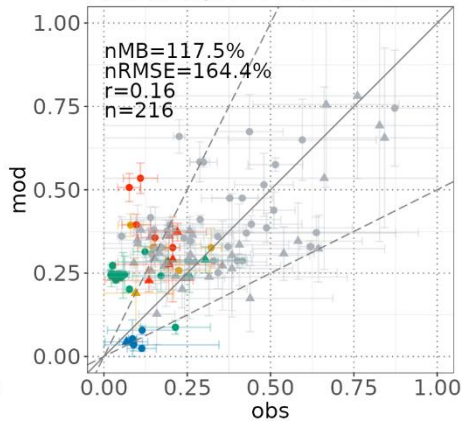
IFS-AER

quar mass ratio
IFS-AER J2014NN 2017 - 2020



MONARCH

quar mass ratio
MONARCH J2014 2006-2010



Size range

- <2um
- <10um
- <20um
- bulk
- 2-20um

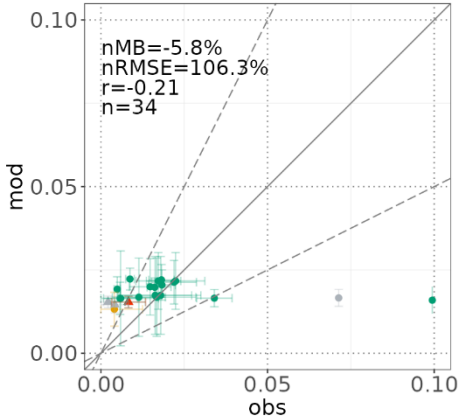
Overestimation of the mass fraction above 2 μm of diameter across models.

Some models also show an underestimation in clay sized fractions (below 2 μm of diameter).

Iron oxides mass fraction evaluation

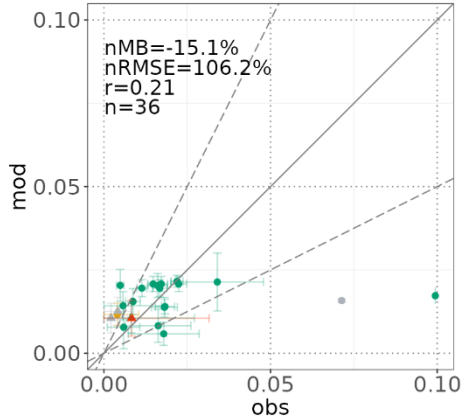
CESM-CAM6

irox mass ratio
CAM6 C1999 2007-2011



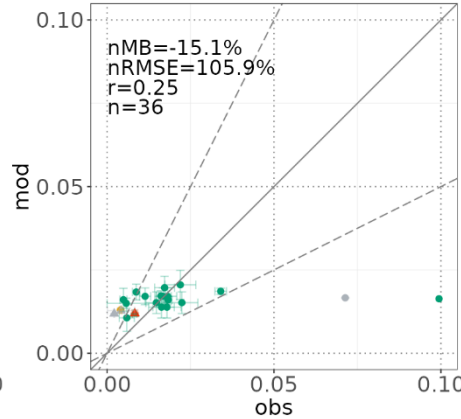
MONARCH

irox mass ratio
MONARCH C1999 2006-2010



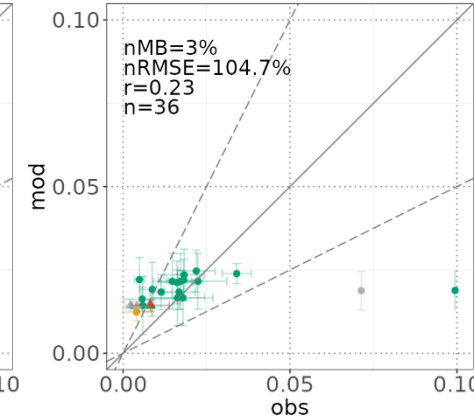
GFDL-AM4

irox mass ratio
GFDL-AM4 C1999 2001-2020



GISS-ModelE

irox mass ratio
ModelE C1999 2011-2020

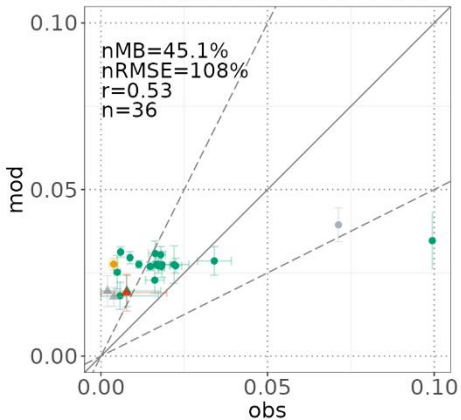


Size range

- <2um
- <10um
- <20um
- bulk
- 2-20um

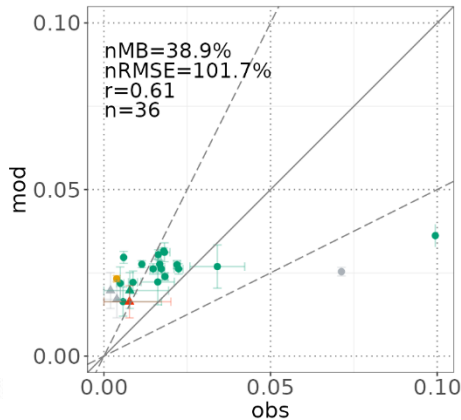
IFS-AER

irox mass ratio
IFS-AER J2014NN 2017 - 2020



MONARCH

irox mass ratio
MONARCH J2014 2006-2010



Size range

- <2um
- <10um
- <20um
- bulk
- 2-20um

Underestimation in models using C1999 and overestimation in models using J2014.

Potentially, improved spatio-temporal distribution of iron oxides in models that use the J2014 soil map.

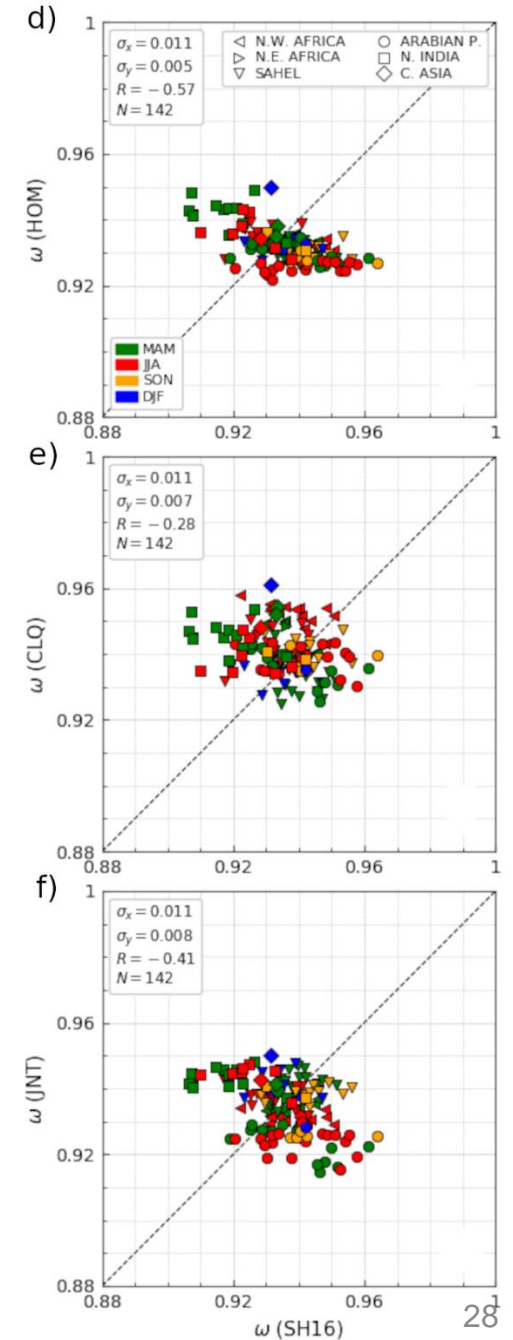
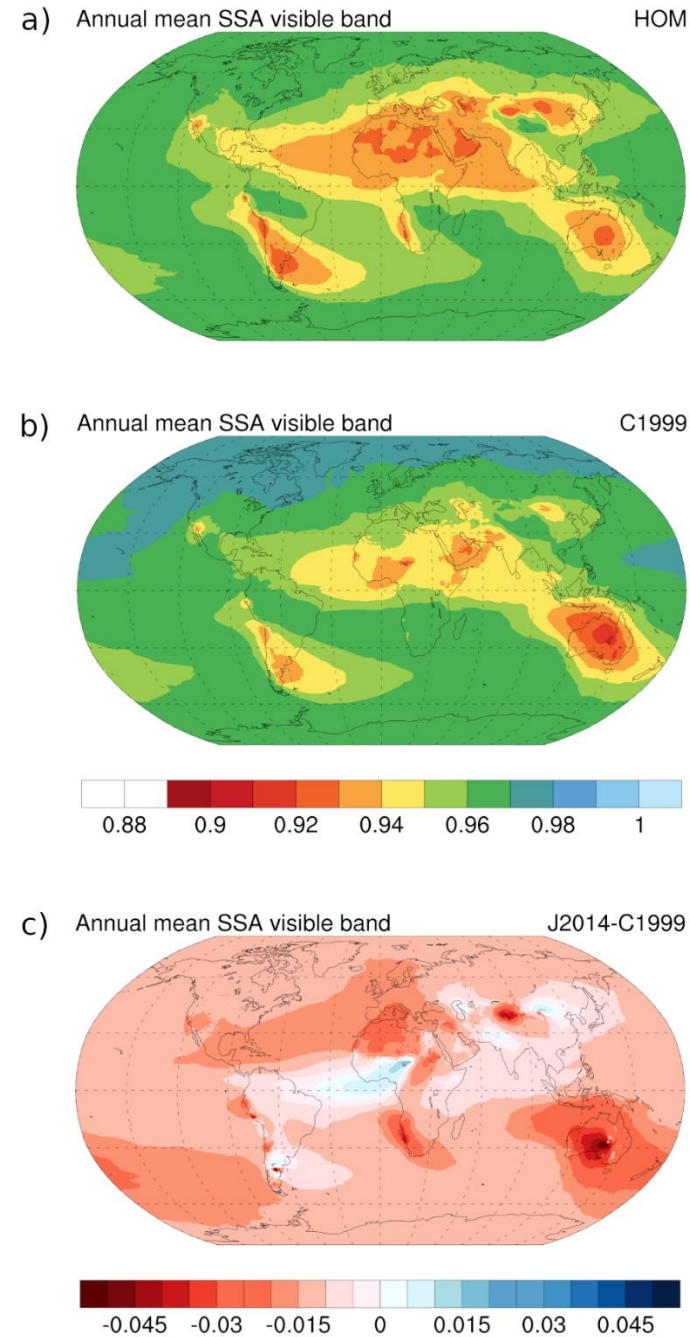
Impacts on the climate system

Impact on dust absorption

- SSA in the visible band as derived from MONARCH considering: optically homogeneous dust, C1999 mineralogy and differences when considering J2014.
- *Evaluation against AERONET retrievals filtered following the criteria in Schuster et al. (2016).*

Diagnostics provided by Vincenzo Obiso (NASA-GISS).
Gonçalves Ageitos et al. (2023, in review)

Check also: Obiso et al. (in review, EGUSPHERE:2023-1166)



Minimal representation of dust mineralogy in an ESM

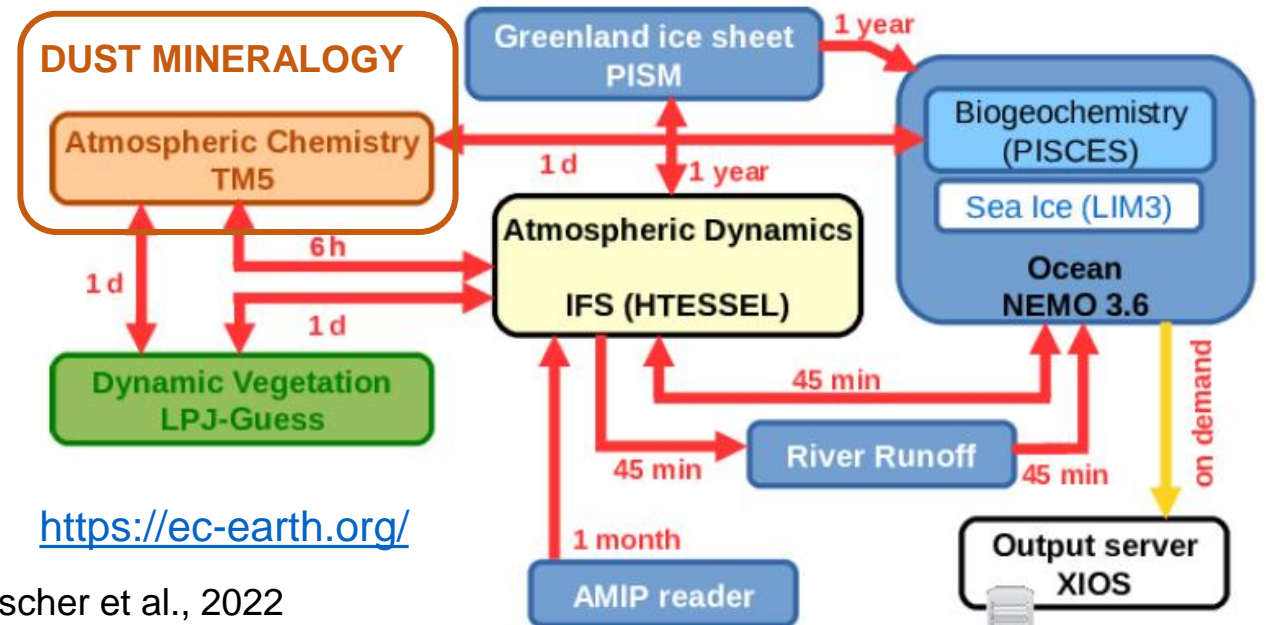
TWO SOIL MINERALOGY MAPS: C1999, J2014

BFT to DEFINE MINERALS' EMITTED PSD: Accumulation and coarse modes.



REPRESENTATION OF THE MINERALOGY TARGETING CLIMATE IMPACTS:

- **Calcite** → to explicitly calculate *aerosols' pH* with the ISORROPIAII thermodynamic equilibrium model.
- **Quartz, feldspar** → to estimate *ice nucleating particles*.
- **Hematite, goethite** → to define *dust optical properties* in the SW.
- All minerals → to derive **iron** from dust.



<https://ec-earth.org/>

Döscher et al., 2022
van Noije et al., 2021
Myriokefalitakis et al., 2022

<https://ec-earth.org/>

Aerosol-sensitive INP parameterizations in EC-Earth3

Costa-Surós et al., in prep.



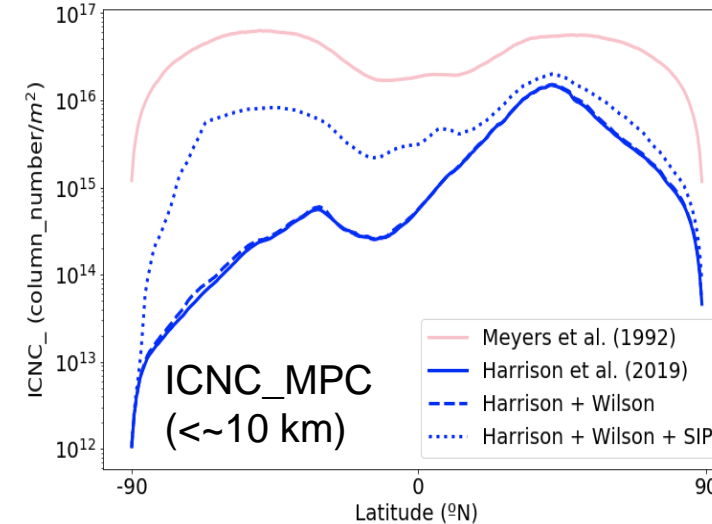
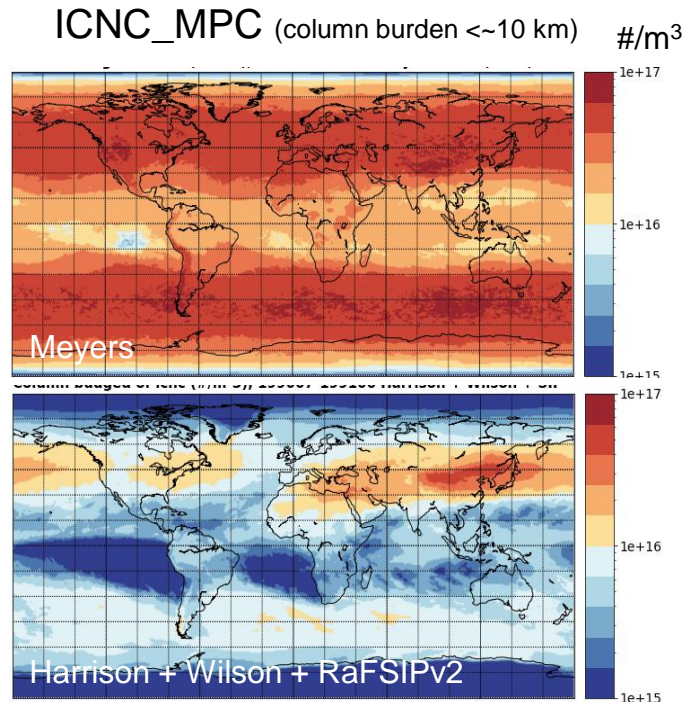
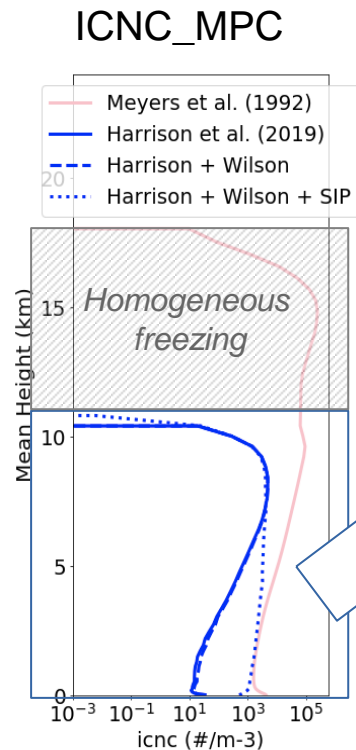
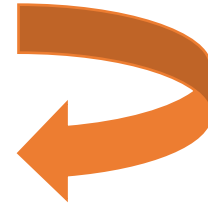
Meyers et al. (1992) – Temperature dependent

Harrison et al. (2019) – k-feldspar and quartz

Wilson et al. (2015) – marine organic aerosols

Secondary ice parameterization (RAFSIP) - Georgakaki et al. (in prep.)

On-going simulations and analyses to determine climate impacts



EC-Earth3
FORCeS 1-year
nudged
experiments with
observed sea ice
concentration and
sea surface
temperature

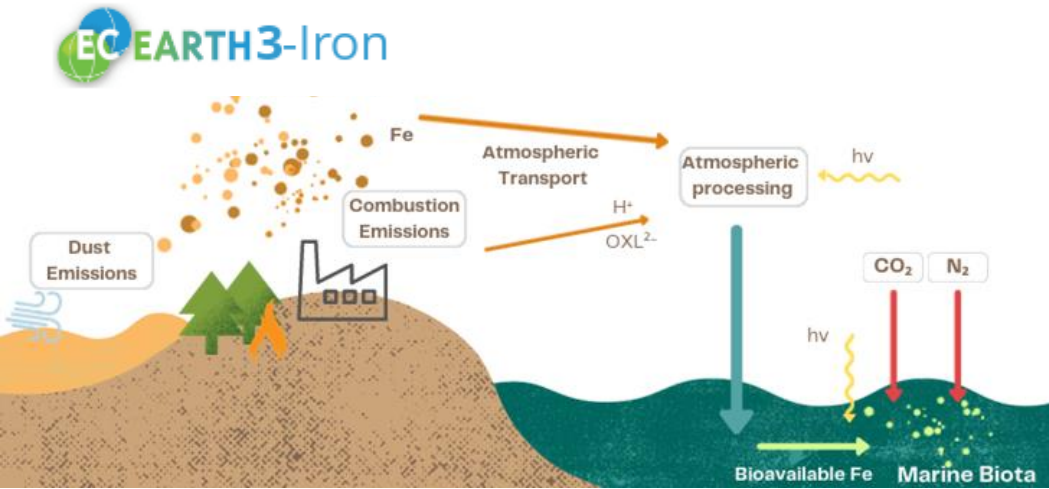


Royal Netherlands
Meteorological Institute
Ministry of Infrastructure
and Water Management



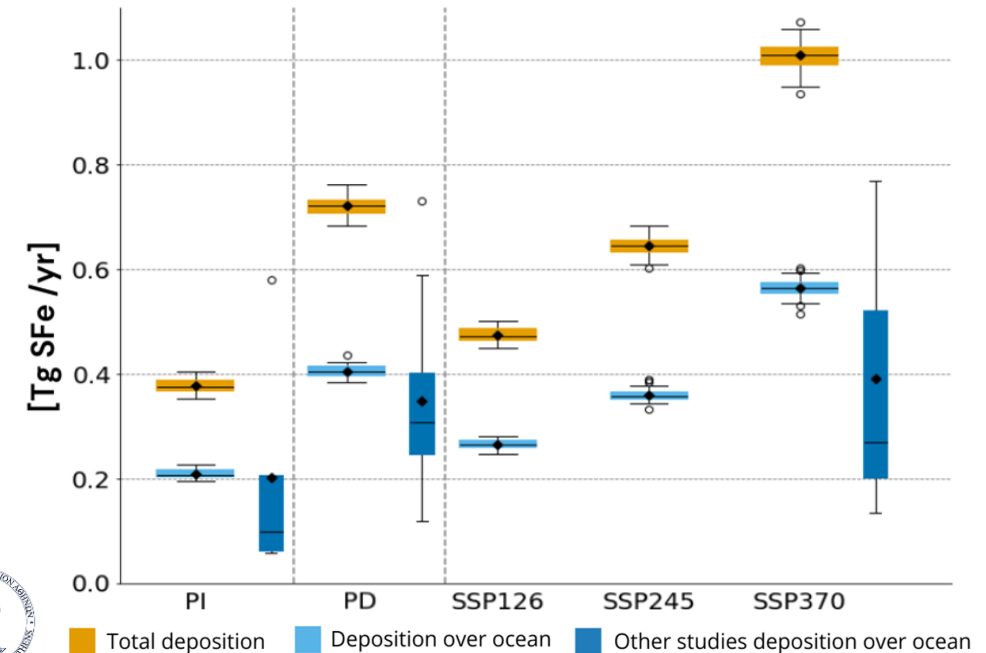
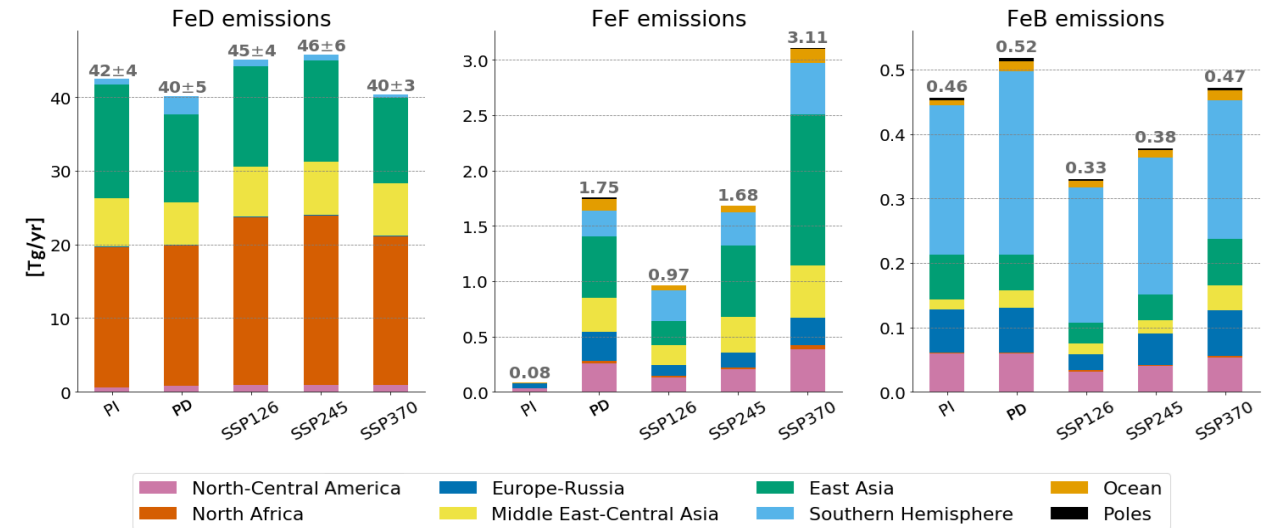
Mineralogy in EC-Earth3-Iron: aerosol pH and soluble iron deposition

Myriokefalitakis et al., 2022
Bergas-Massó et al., 2023



Mineralogy impacts iron from dust and dissolution rates through its effect on aerosols' acidity.

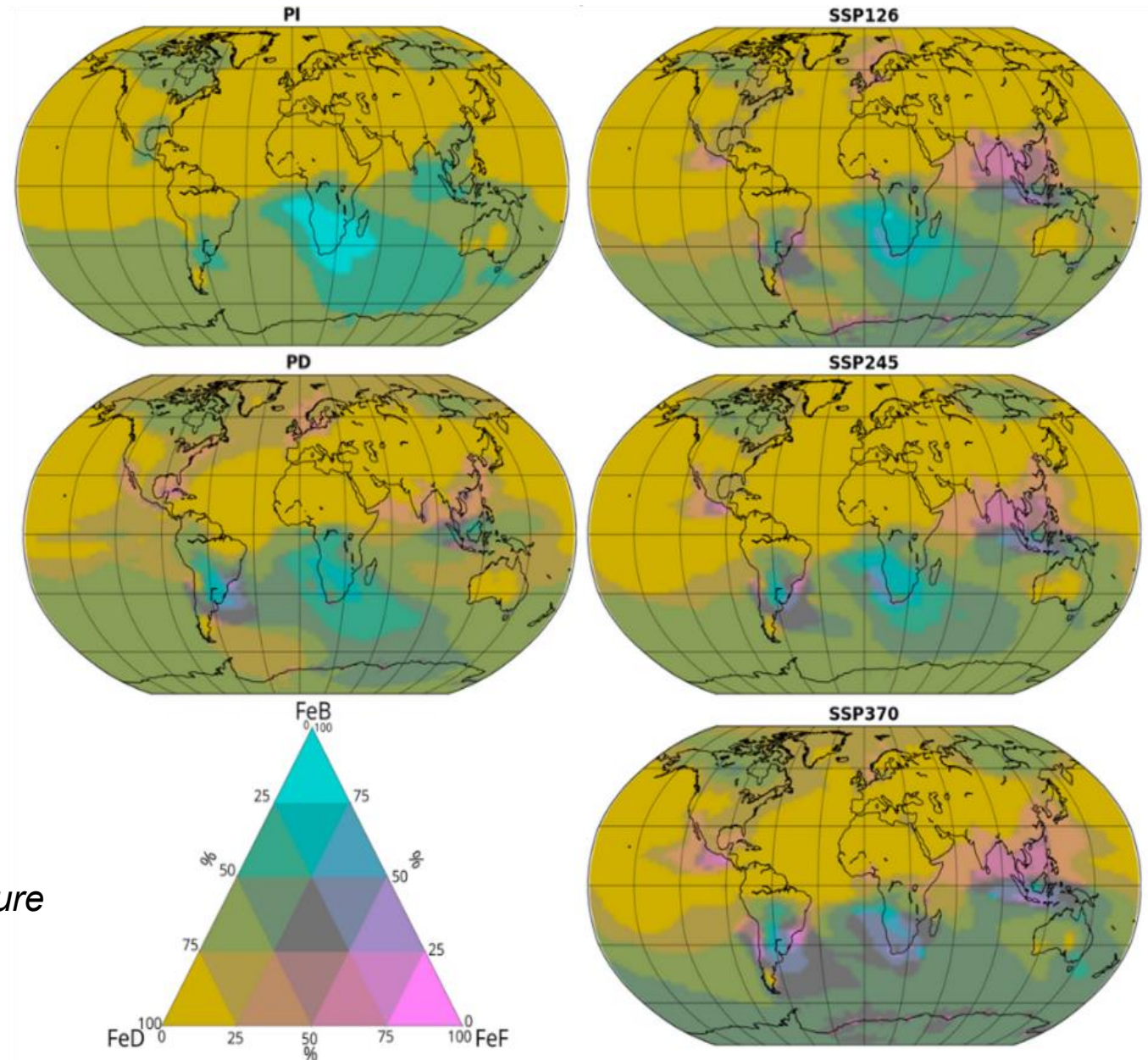
Increased soluble iron deposition in future scenarios attributed to the increase of dissolution precursors and anthropogenic emissions



Source contribution to soluble iron deposition

Relative contribution of **biomass burning**, **anthropogenic combustion** and **mineral dust** sources to the soluble iron deposition in past, present and future climate scenarios.

*Bergas-Massó et al., 2023
Recently published in Earth's Future*



Open questions and future research

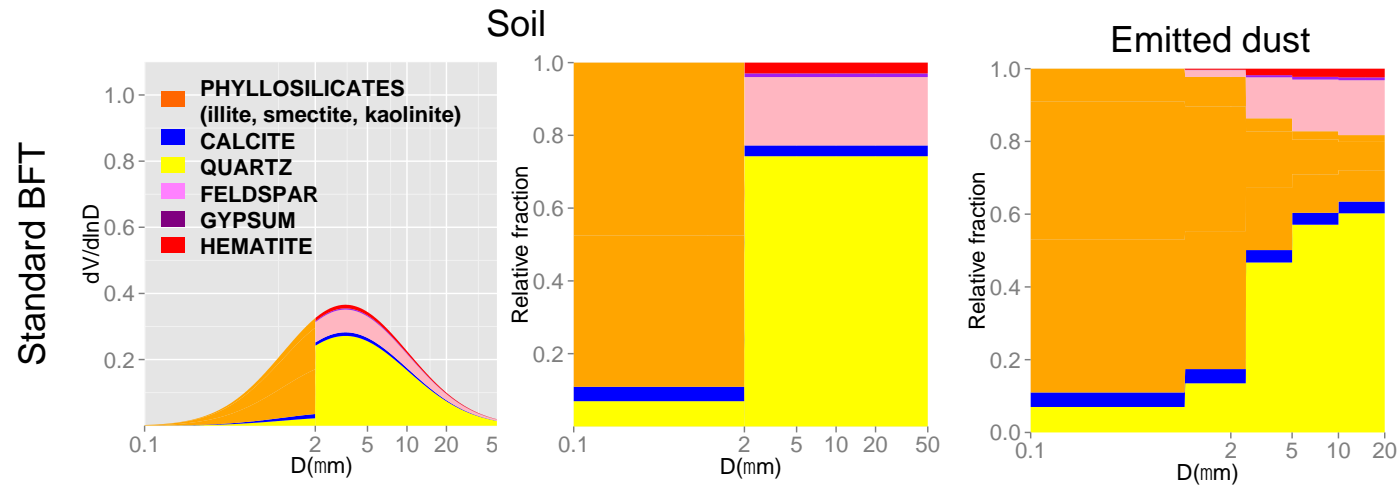
On-going and future work

- Impact of **mineral-dependent** dust **optical properties** and **INP** in **long-term climate** experiments (e.g., FORCeS and AEROCOM DURF experiments) with EC-Earth3.
- Assess the contribution of **anthropogenic dust sources** and **improved biomass burning** emissions upon **soluble iron** deposition with EC-Earth3-Iron.
- Exploit FRAGMENT ERC (experimental campaigns in Morocco, Iceland, US and Jordan) data to further **constrain the minerals emitted size distribution**.

Summary and conclusions

- Common soil map and emission method → Variability across models due to different size distribution, transport and removal processes.
- Similar evaluation metrics against mineral fractions (likely dominated by observations close to sources)
- Relevance of the size-distributed mineralogy at emission (e.g., overestimation of quartz in aerosol silt sizes).
- Issues with the soil maps, particularly relevant for iron oxides
- Significant impact in our model results: dust SSA, ice crystal number concentrations, iron emission and dissolution.

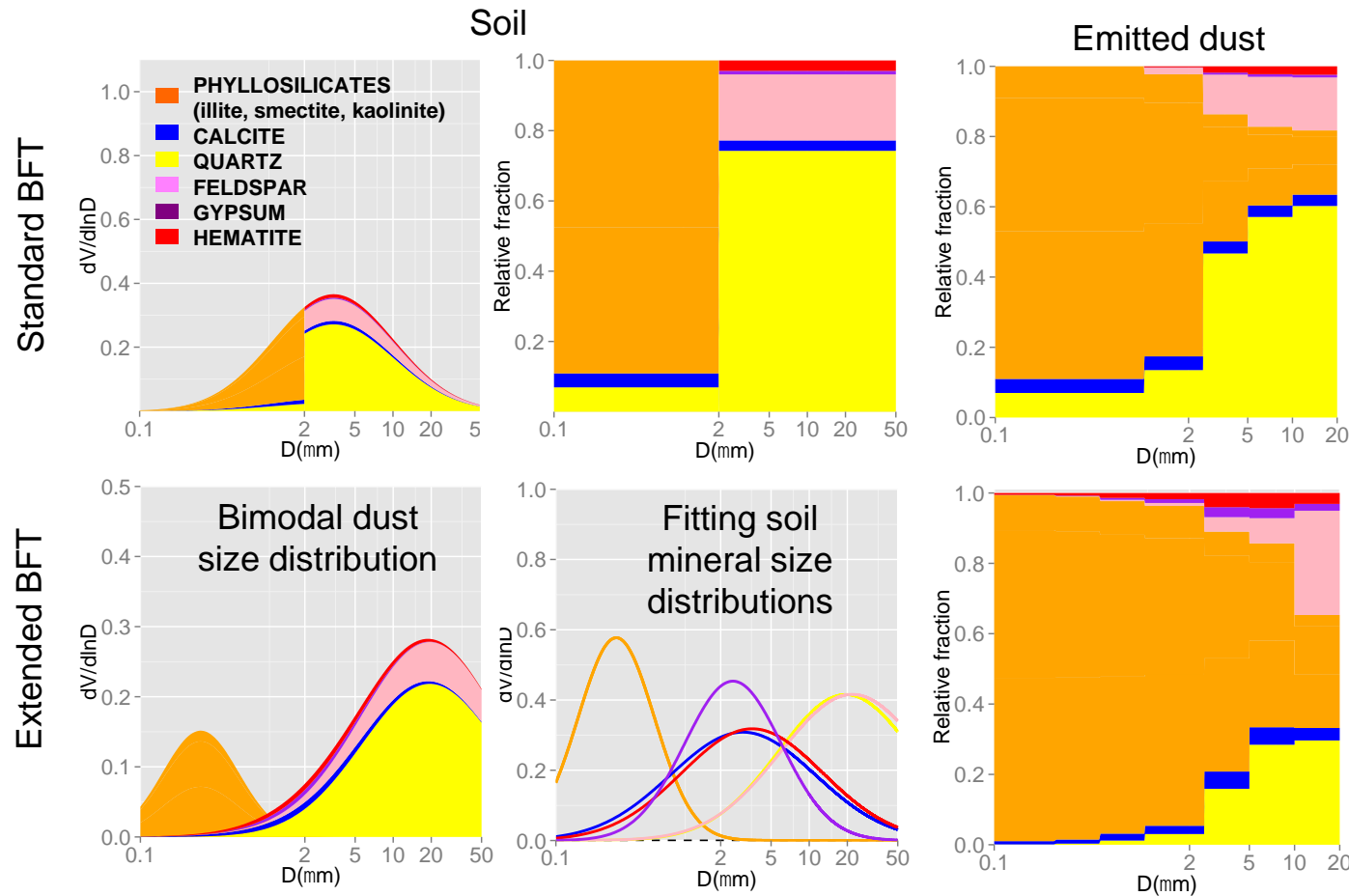
Refining the mineral fractions at emission



*Perlwitz et al., 2015a,b;
Pérez García-Pando et al., 2016;*

Extended BFT proposed by C. Pérez García-Pando

Refining the mineral fractions at emission

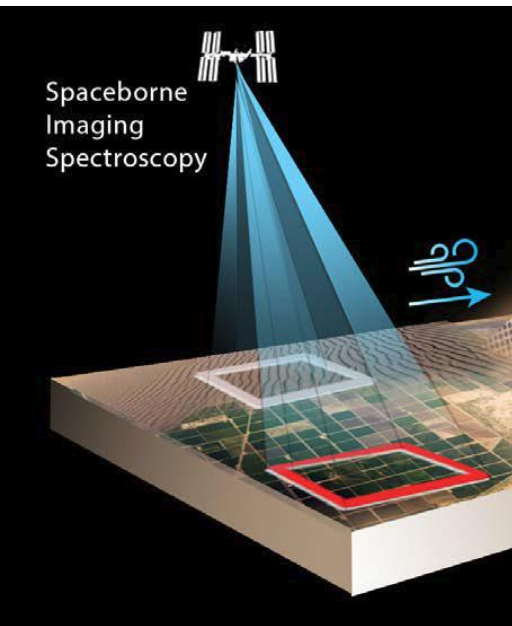


*Perlwitz et al., 2015a,b;
Pérez García-Pando et al., 2016;*

Pérez García-Pando et al., in prep.

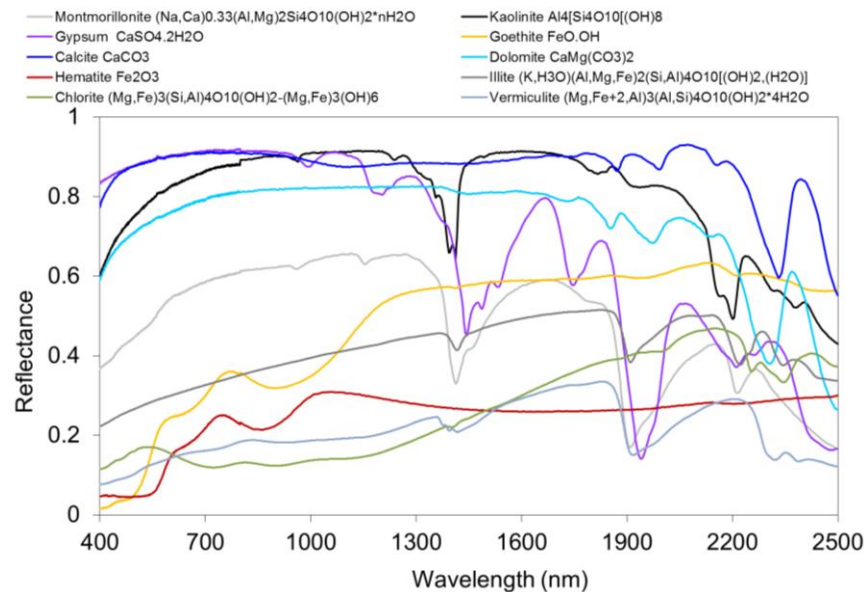
Extended BFT proposed by C. Pérez García-Pando

New mineralogy maps from NASA EMIT (Green et al. 2020)

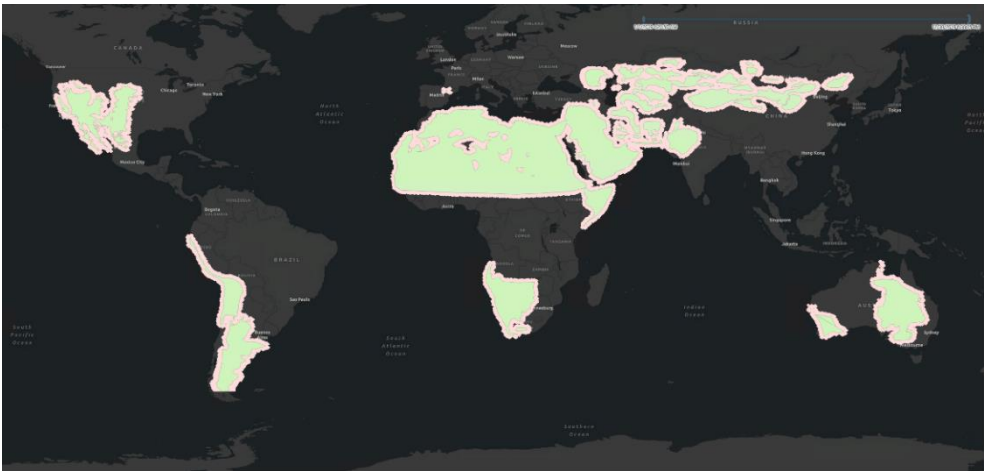


The EMIT instrument is measuring from the ISS since July 14, 2022.

VSWIR Spectra of Dust Source Minerals



Dust Minerals have distinct spectral signatures



Target mask for EMIT retrievals covering arid land regions

Level 3 products – map of 10 (+2) minerals to be used within ESMs

Thank you !

Acknowledgments

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Maria Kanakidou (U. Crete)
Anasthasios Nenes (EPFL)
Georgakaki Paraskevi (EPFL)
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Philippe Le Sager (KNMI)

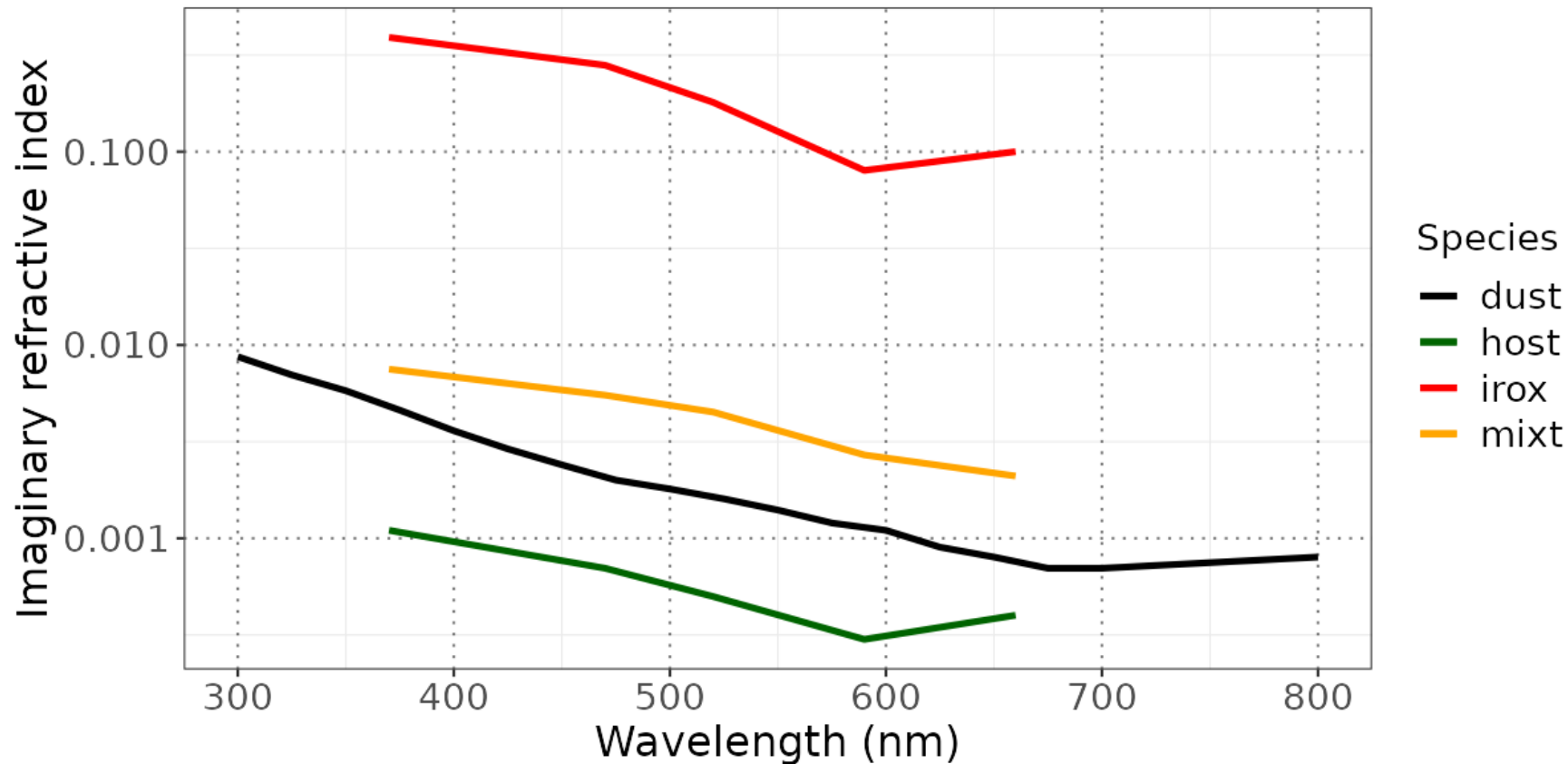


European Research Council
Established by the European Commission



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- Thanks to all the providers of the observational data used for the model evaluation.

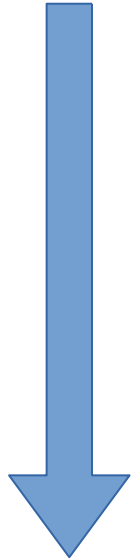
Dust and mineral refractive indexes MONARCH



- Host minerals: refractive index from Scanza et al. (2015) with abundances as median of DiBiaggio et al. (2019)
- Accretions: assumed 5w% of hematite, RI interpolated from DiBiaggio et al. (2019).
- Pure iron oxides: fitting DiBiaggio et al. (2019) with MG mixing rule.
- Homogeneous dust refractive index from Sinyuk et al. 2003.

New heterogeneous ice nucleation parameterization

ICNC
estimation



Ice crystal
growth by
vapor
deposition

Temperature-sensitive ice nucleation parameterization

Meyers et al. (1992): deposition-
condensation freezing

$$N_i = 1000 \exp[12.96(e_{sl} - e_{si})/e_{si} - 0.639]$$

N_i : ice crystal number concentration

e_{sl} : saturation vapor pressure with respect to liquid water

e_{si} : saturation vapor pressure with respect to ice

Aerosol-sensitive ice nucleation parameterization

PRIMARY ICE
PRODUCTION

Immersion freezing

Atkinson et al. (2013): K-feldspar

or

Ullrich et al. (2017): soot and dust

or

Harrison et al. (2019): K-feldspar and quartz



Wilson et al. (2015):
of marine organic
aerosols

SECONDARY
ICE
PROCESSES

Georgakaki et al. (in prep.): RaFSIP, which considers:

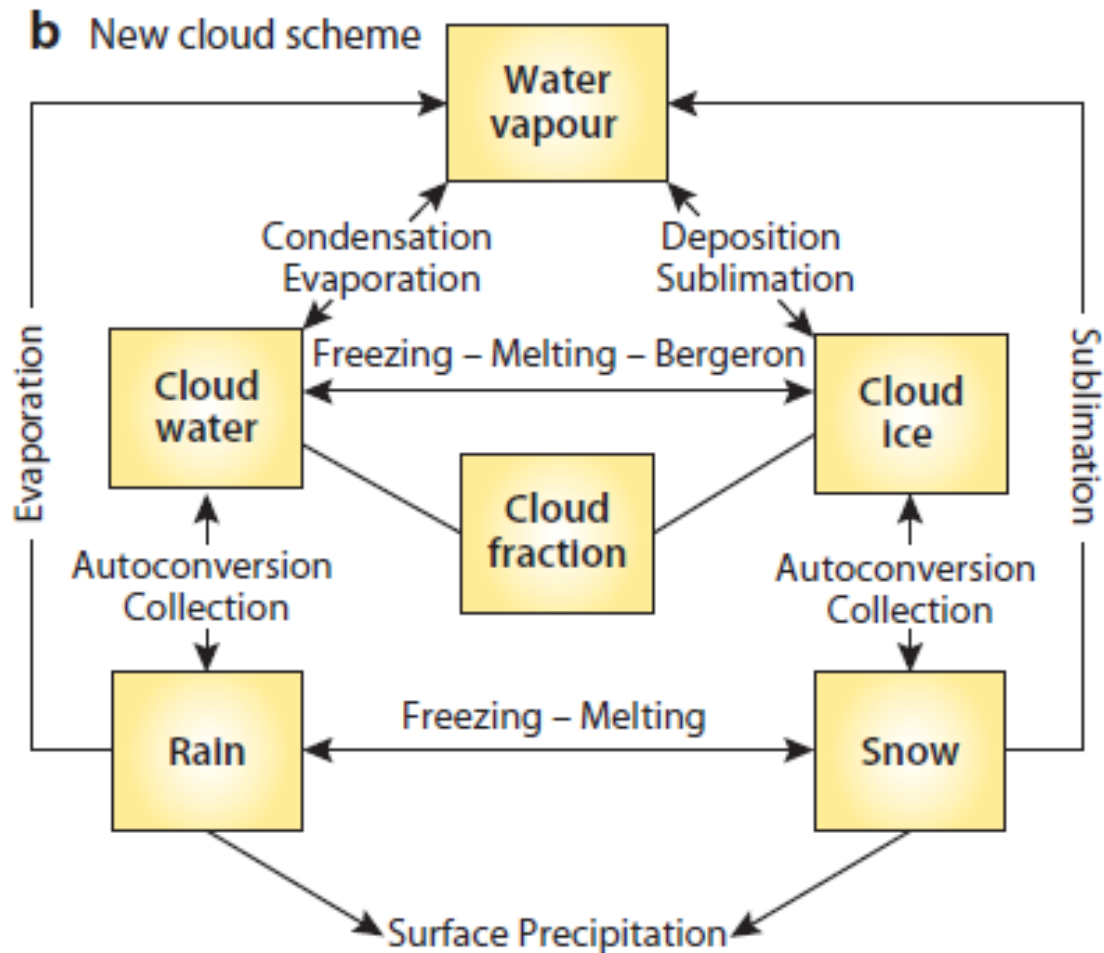
- Hallet-Mossop process
- Droplet shattering during freezing
- Fragmentation due to collisional break-up

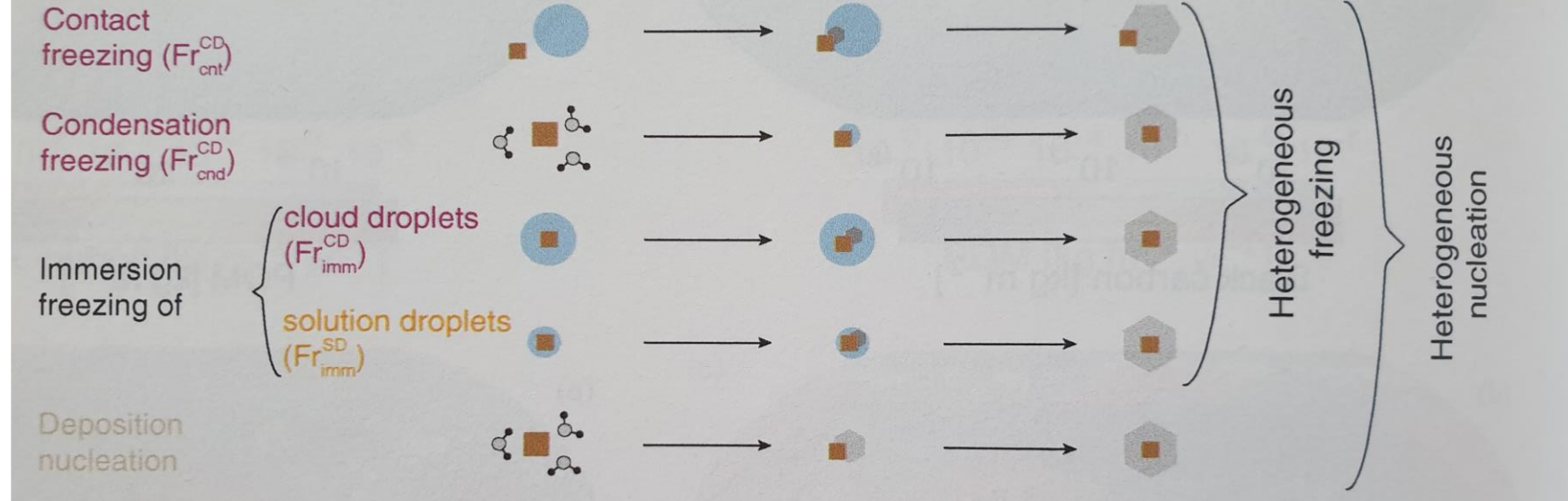
Depositional growth parameterization

Following Pruppacher and Klett (1997) and Rotstajn et al. (2000)

Costa-Surós et al., in prep.

IFS cloud microphysics





Collision fragmentation,
Hallett-Mossop or rime-splintering
Droplet shattering
Sublimation fragmentation

SIP

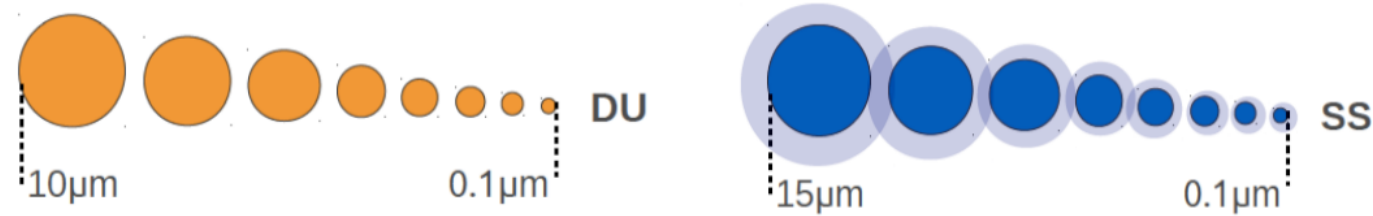
Lohmann et al., 2016

MONARCH

Aerosol Scheme

Sectional

dust (DU)
sea-salt (SS)



Bulk

Black Carbon (BC)



Organic Aerosols (OA)

Primary Organic Aerosols (POA)

Secondary organic aerosols (SOA)

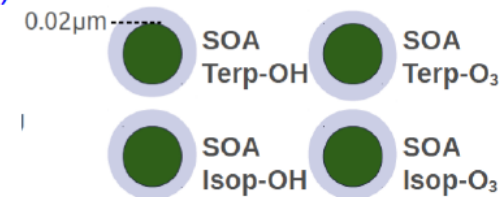
4 gaseous tracers (OH, O₃, TERP, ISOP). Online emission (MEGAN)

4 aerosol-phase hydrophilic tracers

2-product scheme of Tsigaridis and Kanakidou (2007)

Oxidation by OH and O₃ and gas-particle partitioning

Anthropogenic SOA from Toluene and Xylene under development



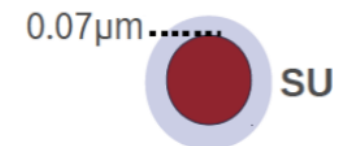
Sulfate (SU):

4 additional prognostic tracers (SO₂, DMS, H₂O₂, H₂SO₄)

3 online or climatological oxidants (OH, O₃, HO₂)

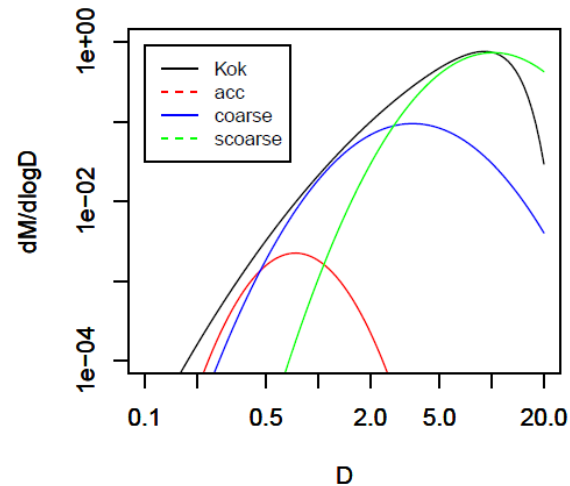
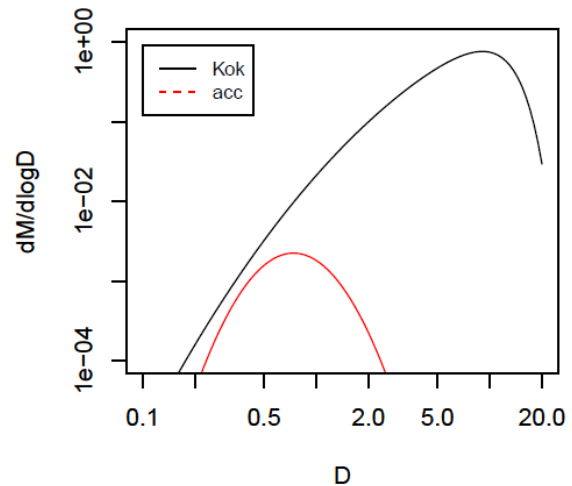
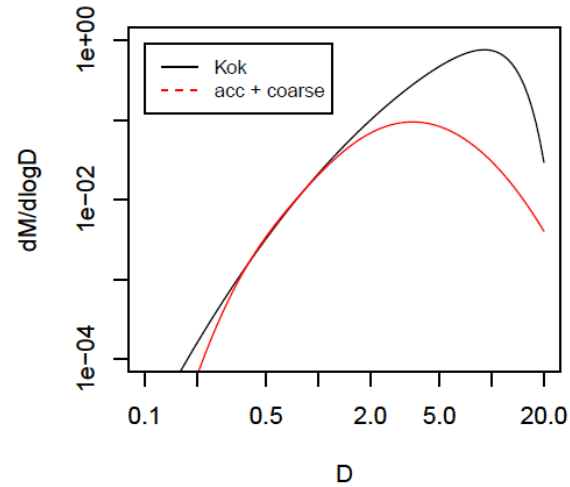
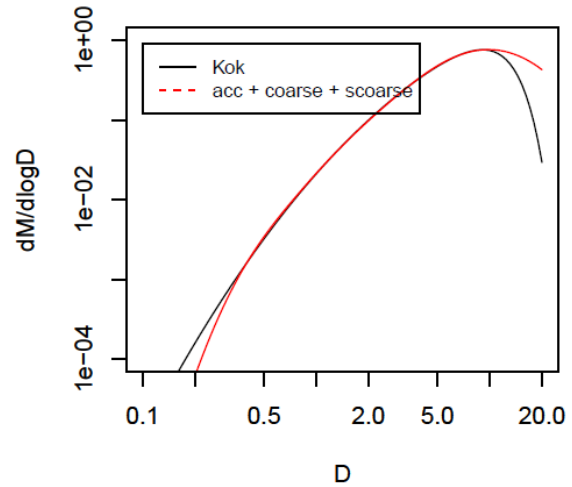
gas-phase oxidation of SO₂, DMS and H₂O₂ by OH

aqueous-phase oxidation by H₂O₂ and O₃



Nitrate (NO₃) and Ammonium (NH₄): as calculated by EQSAM thermodynamic equilibrium model but not evaluated yet

Kok size distribution fitted with modal PSD



Thanks to C. Pérez García-Pando